

# Prospects for Petascale Climate Modeling: Can Kilo-Processors, Exa-Flops and Peta-Bytes \* Make a Difference in Predicting Earth's Climate?

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*ICTP Workshop on  
High Resolution Climate Modeling  
Trieste, Italy  
13 August 2009*

**Mega-Processors, Zetta-Flops and Exa-Bytes?**

Prefix	Symbol	Power of 10	Power of 2 (-byte)
yocto-	y	$10^{-24}$	--
zepto-	z	$10^{-21}$	--
atto-	a	$10^{-18}$	--
femto-	f	$10^{-15}$	--
pico-	p	$10^{-12}$	--
nano-	n	$10^{-9}$	--
micro-	m	$10^{-6}$	--
milli-	m	$10^{-3}$	--
centi-	c	$10^{-2}$	--
deci-	d	$10^{-1}$	--
	--	$10^0$	--
deka-	D	$10^1$	--
hecto-	h	$10^2$	--
<b>kilo-</b>	<b>k or K</b>	<b><math>10^3</math></b>	<b><math>2^{10}</math></b>
mega-	M	$10^6$	$2^{20}$
giga-	G	$10^9$	$2^{30}$
tera-	T	$10^{12}$	$2^{40}$
<b>peta-</b>	<b>P</b>	<b><math>10^{15}</math></b>	<b><math>2^{50}</math></b>
<b>exa-</b>	<b>E</b>	<b><math>10^{18}</math></b>	<b><math>2^{60}</math></b>
zett a-	Z	$10^{21}$	$2^{70}$
yott a-	Y	$10^{24}$	$2^{80}$

processors (~100K-cores)

bytes  
flops \*

\* e.g. Cray XT5 (kraken) at NICS: 607 peak teraflops \* 86400 sec/day = 50 (peak) exaflops/day

# 10 Points

A silhouette of a person leading two camels across a desert landscape at sunset. The sun is a large, bright white circle in the center of the sky, which is a deep red. The camels and the person are dark silhouettes against the bright sky. The horizon line is a dark, wavy shape at the bottom of the image.

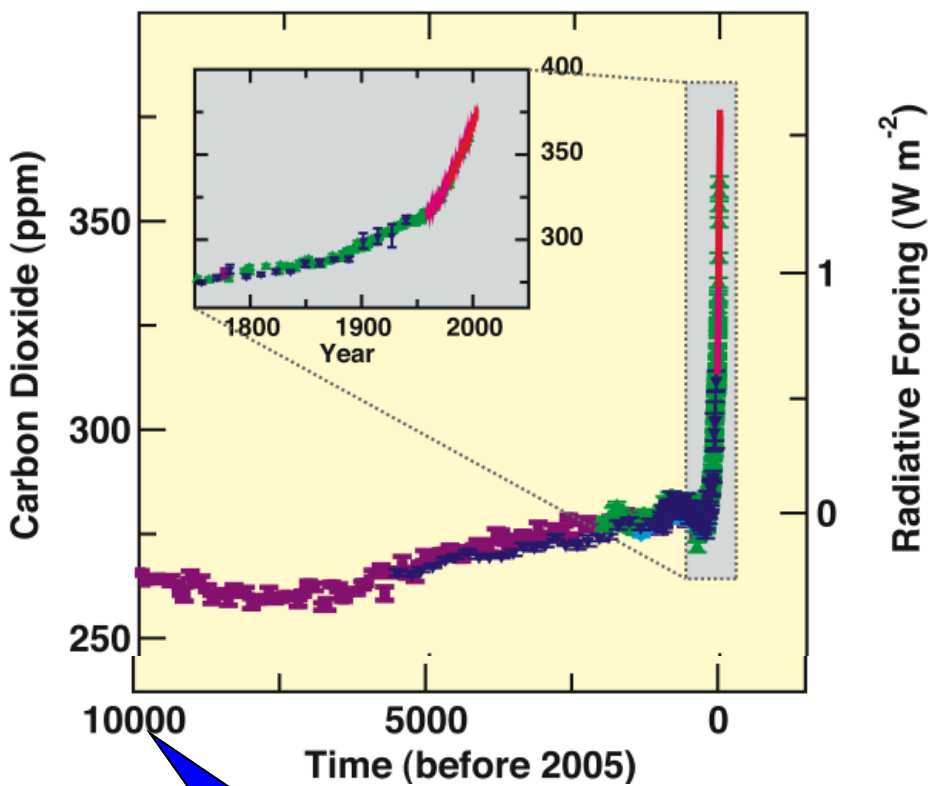
1. **Climate change is most difficult and important problem**
2. **Scientific consensus: humans contribute to climate change**
3. **World, urgently engaged in global mitigation and regional adaptation strategies, needs detailed regional information**
4. **IPCC AR4: considerable uncertainty in predictions of magnitude of global change**
5. **... and uncertainties in regional climate are even bigger**
6. **Climate prediction is very computationally demanding**
7. **Climate spatial scales span 10 decades, but current models resolve less than 4 decades**
8. **Within 6 years, peak capability of 100 petaflops,  $10^7$  computing units**
9. **Parallel computation means new software, algorithms and models**
10. **... and new methods in workflow management, data management, and visualization**



# Climate Change

A dramatic sunset scene with a large, bright sun low on the horizon, casting a warm orange and red glow across the sky. In the foreground, the silhouettes of two camels and a person are visible against the dark, hilly landscape. The person is standing next to the first camel, and the second camel is slightly behind it. The overall mood is serene yet somber, reflecting the theme of climate change.

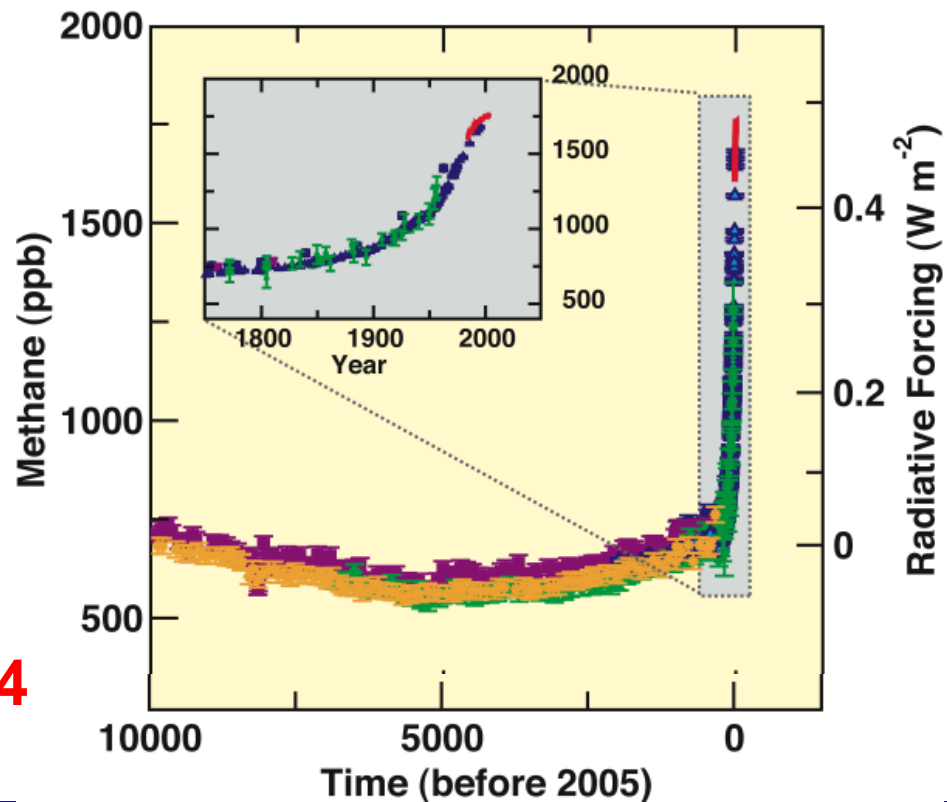
**1. Climate change is arguably the most difficult and most important problem facing governments, industries and societies across the Earth.**



CO<sub>2</sub>

end of last ice age

CH<sub>4</sub>

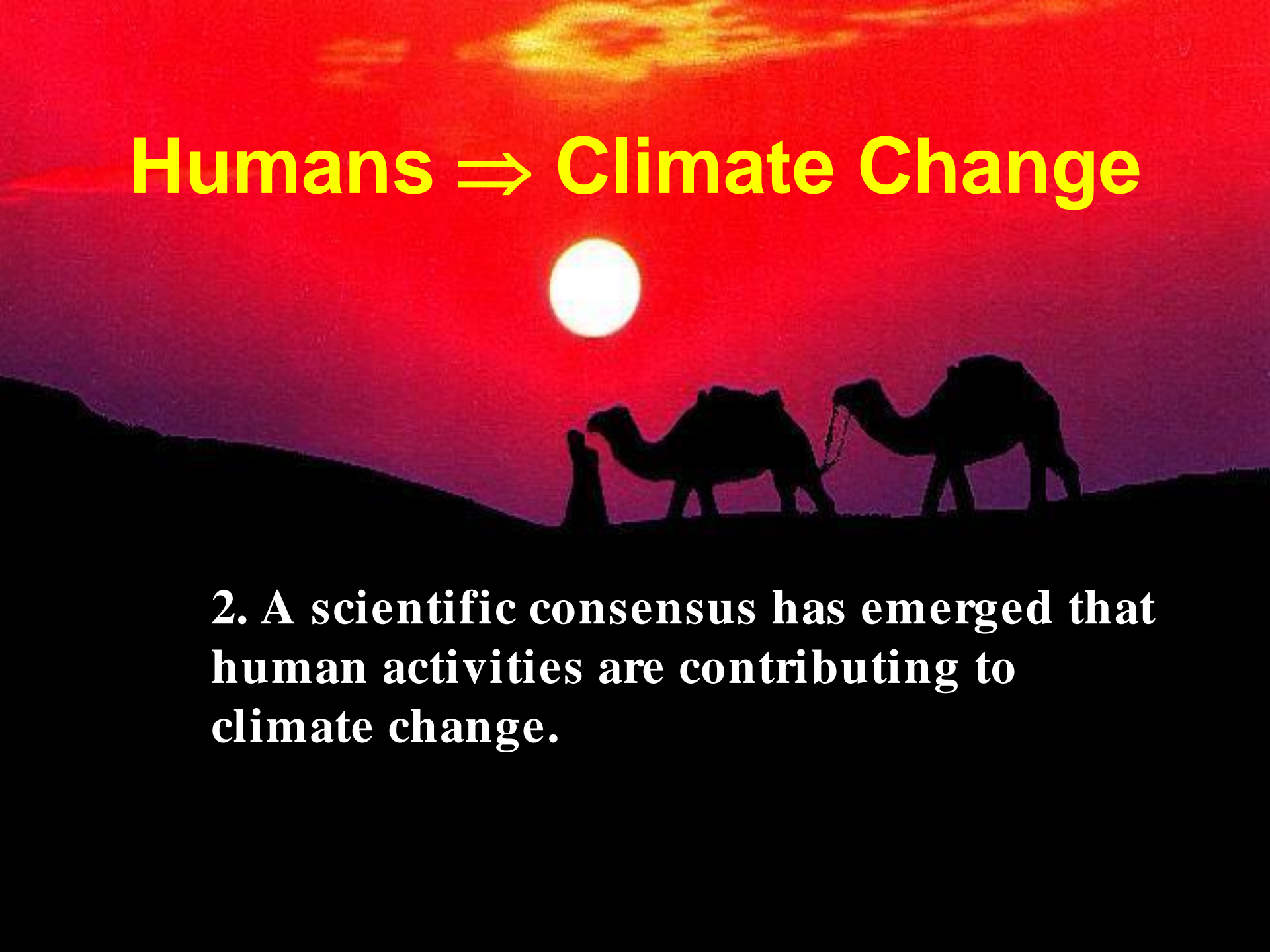


# Cost of Climate Change

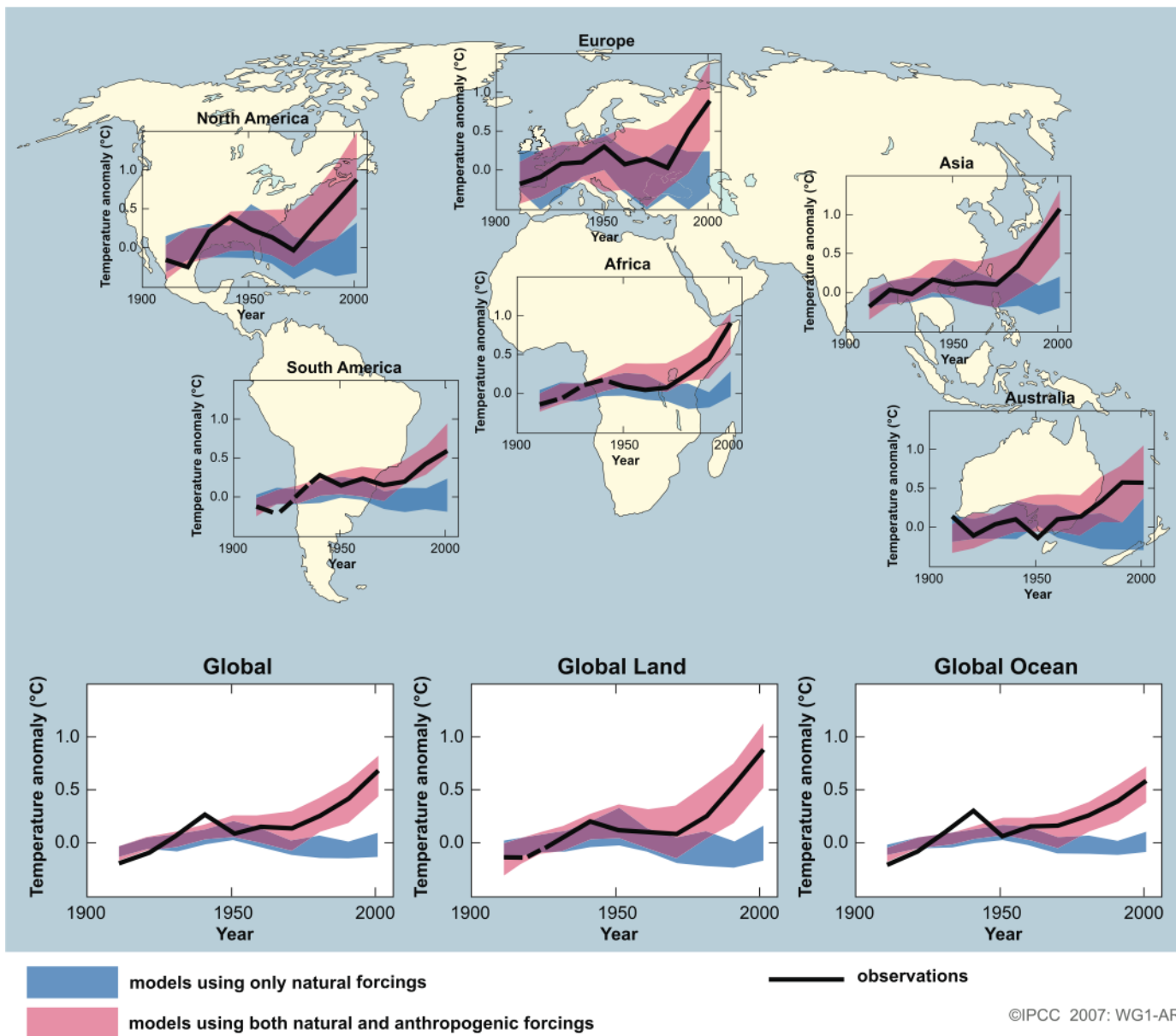
- Consequences of climate change estimated at several % of world GDP by mid- to late-21<sup>st</sup> century
- Mitigation efforts to reduce impacts of climate change estimated at 1% of world GDP  
(world GDP in 2007: €34 trillion)

**Stern Report, 2007**

# Humans $\Rightarrow$ Climate Change

A background image showing the silhouettes of two camels and a person walking across a desert landscape at sunset. The sky is a gradient of orange and red, with a large, bright sun low on the horizon. The silhouettes are dark against the bright sky.

**2. A scientific consensus has emerged that human activities are contributing to climate change.**

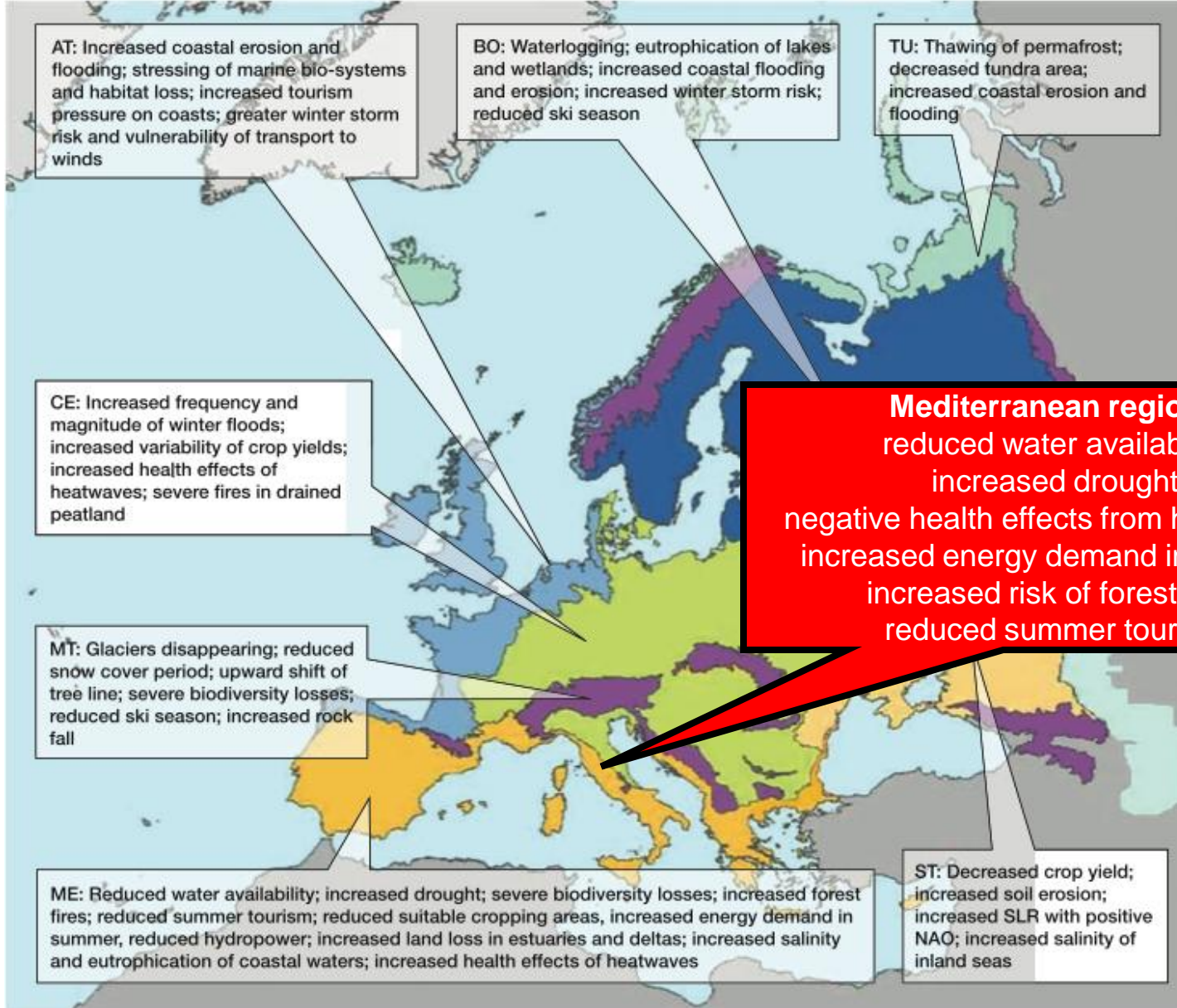




# **Global Mitigation; Regional Adaptation**

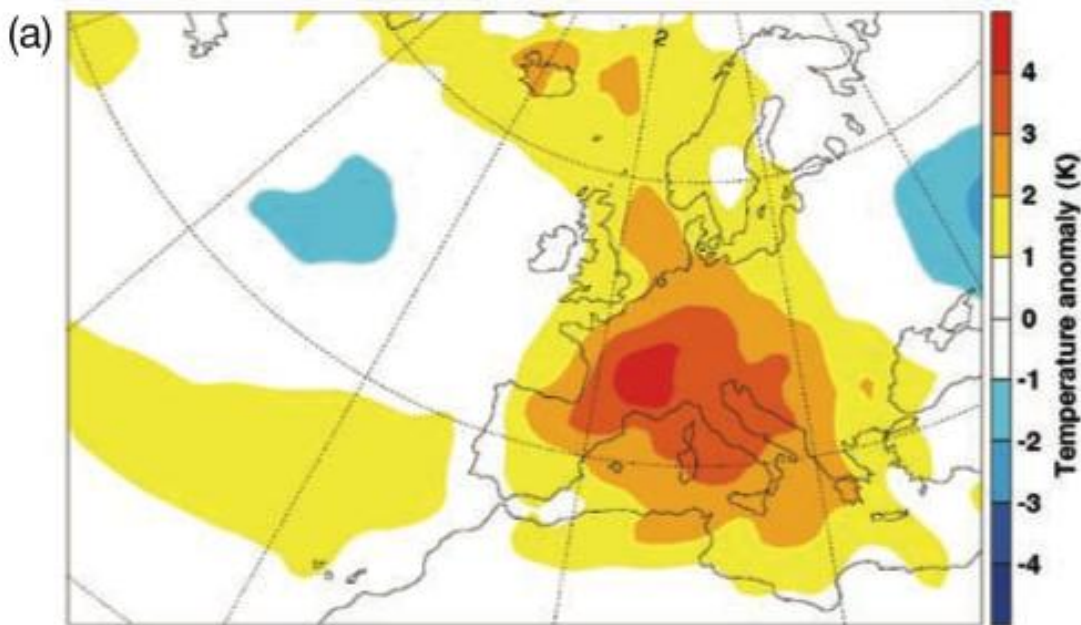
A background image showing the silhouettes of two camels and a person walking across a desert landscape at sunset. The sun is a bright white circle in a sky transitioning from red at the top to purple at the bottom. The ground is a dark silhouette.

**3. The world community is now urgently engaged in discussion of strategies for global mitigation of, and regional adaptation to, climate change, which require detailed regional information such as is provided by climate models.**



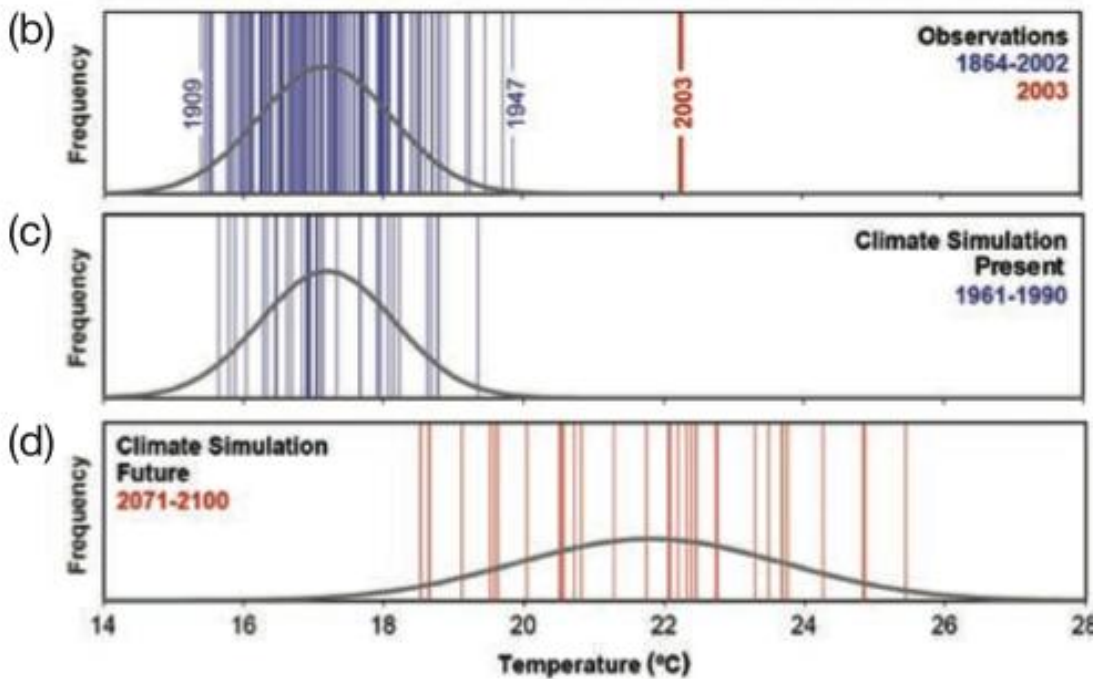
**Figure 12.3.** Key vulnerabilities of European systems and sectors to climate change during the 21st century for the main biogeographic regions of Europe (EEA, 2004a): TU: Tundra, pale turquoise. BO: Boreal, dark blue. AT: Atlantic, light blue. CE: Central, green; includes the Pannonian Region. MT: Mountains, purple. ME: Mediterranean, orange; includes the Black Sea region. ST: Steppe, cream. SLR: sea-level rise. NAO: North Atlantic Oscillation. Copyright EEA, Copenhagen. <http://www.eea.europa.eu>





## Summer 2003 European Heat Wave

How likely is such an event in the future?



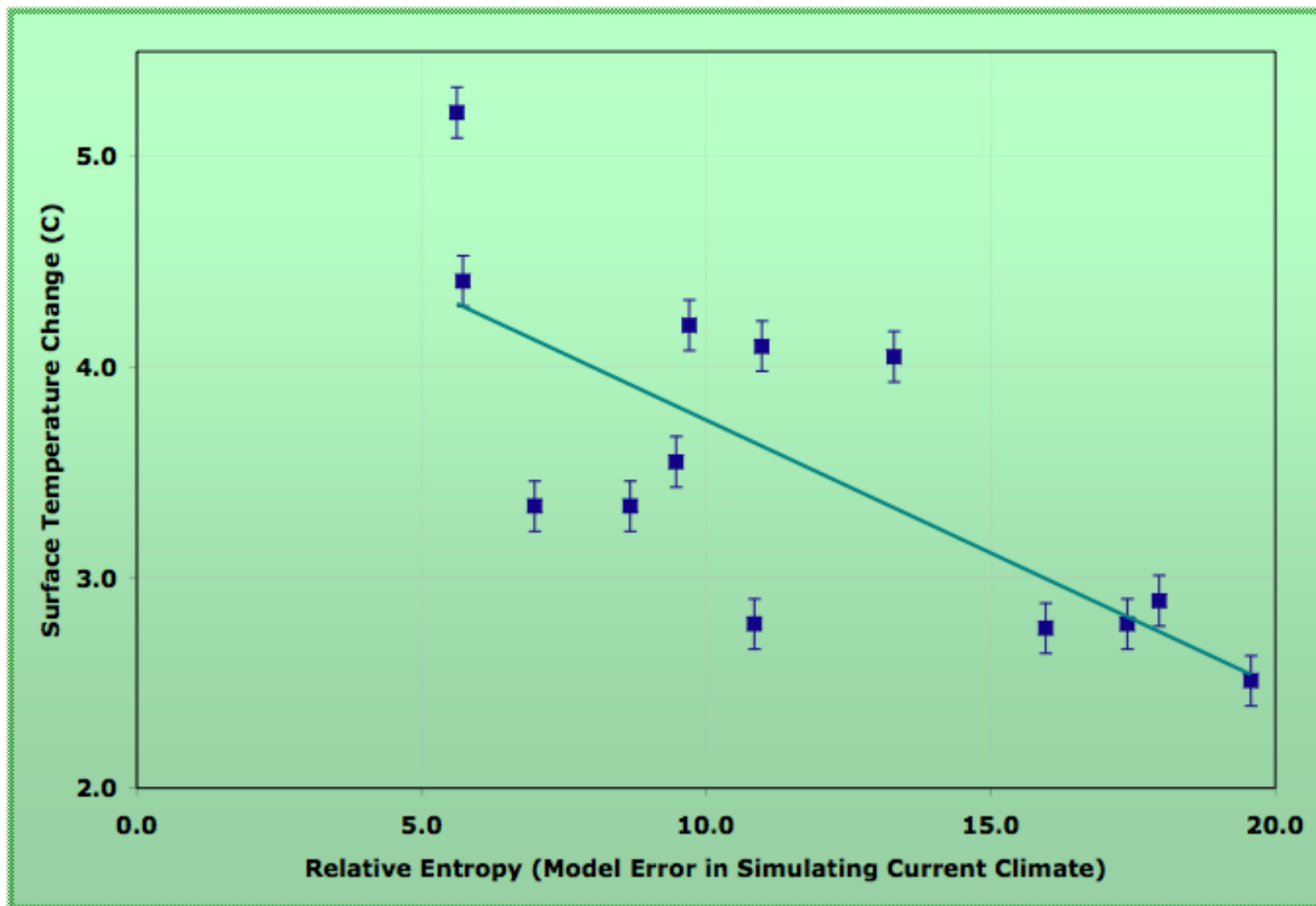
**Figure 12.4.** Characteristics of the summer 2003 heatwave (adapted from Schär et al., 2004). (a) JJA temperature anomaly with respect to 1961 to 1990. (b) to (d): JJA temperatures for Switzerland observed during 1864 to 2003 (b), simulated using a regional climate model for the period 1961 to 1990 (c) and simulated for 2071 to 2100 under the A2 scenario using boundary data from the HadAM3H GCM (d). In panels (b) to (d): the black line shows the theoretical frequency distribution of mean summer temperature for the time-period considered, and the vertical blue and red bars show the mean summer temperature for individual years. Reprinted by permission from Macmillan Publishers Ltd. [Nature] (Schär et al., 2004), copyright 2004.

# Uncertainty

A silhouette of a person leading two camels across a desert landscape at sunset. The sun is a bright white circle in a sky transitioning from red at the top to purple at the bottom. The camels and the person are dark shapes against the colorful background.

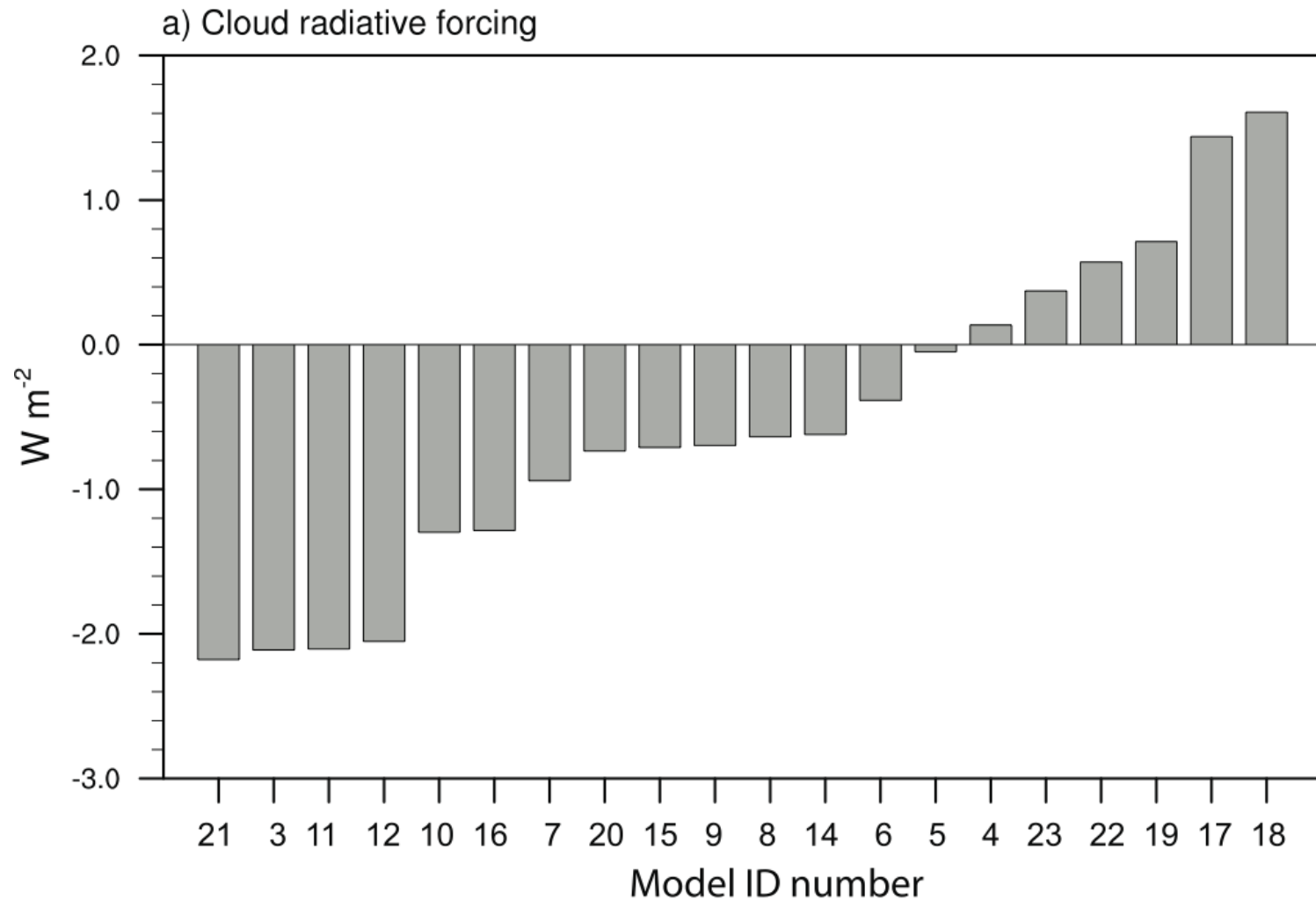
**4. As reflected in the IPCC Fourth Assessment Report, there continues to be considerable uncertainty in predictions of the magnitude of global warming.**





Climate Model Fidelity and Projections of Climate Change  
J. Shukla, T. DelSole, M. Fennessy, J. Kinter and D. Paolino  
*Geophys. Research Letters*, **33**, doi10.1029/2005GL025579, 2006

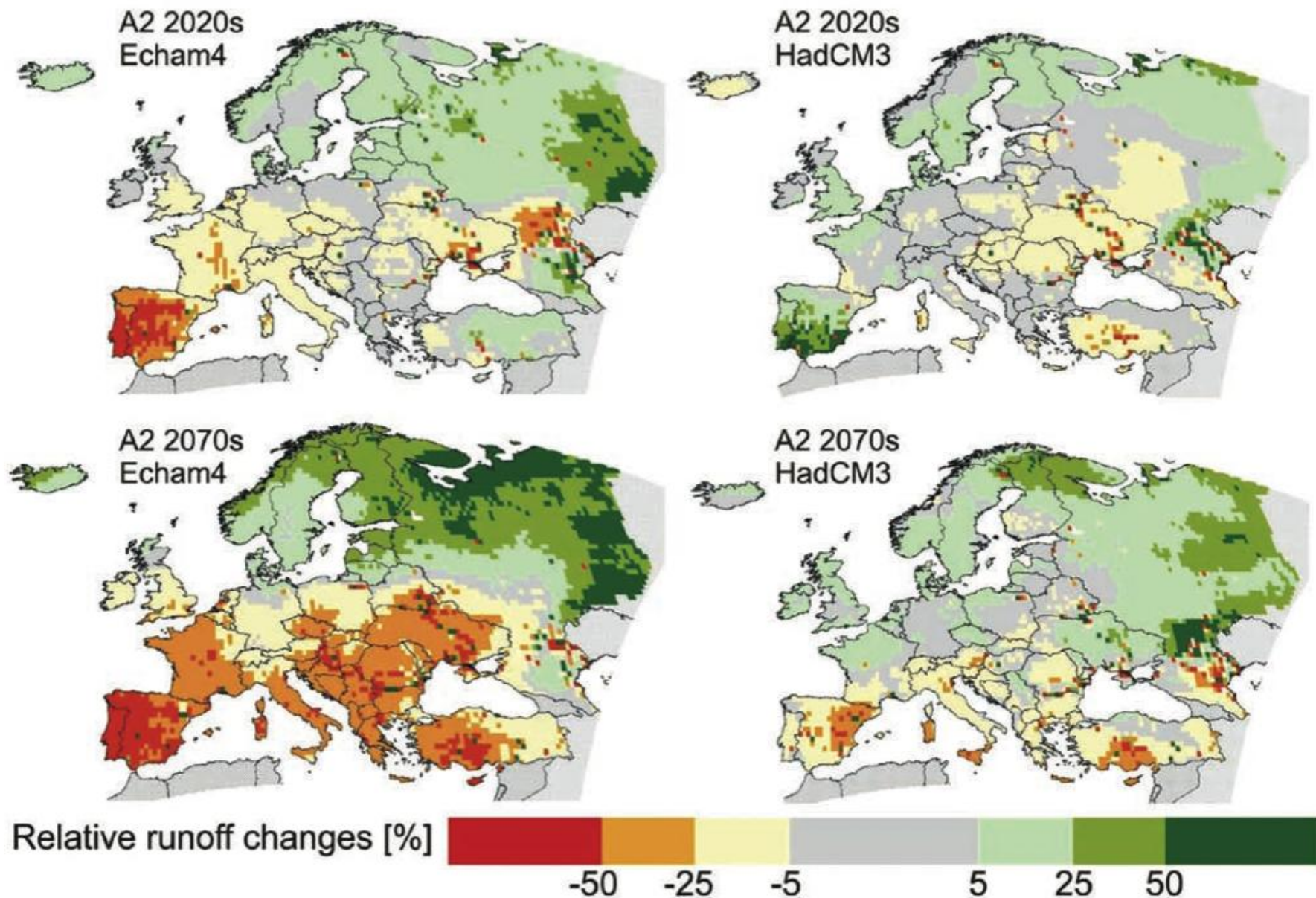
# Clouds: Still the Largest Source of Uncertainty



# Regional Climate Change

A background image showing the silhouettes of two camels and a person walking across a desert landscape at sunset. The sky is a vibrant orange and red, with a large, bright sun low on the horizon. The silhouettes are dark against the bright sky.

**5. On the regional level, uncertainties in regional climate change, e.g. whether we can expect more floods or more droughts, more storms or longer periods of unsettled weather, are even bigger.**



**Figure 12.1.** Change in annual river runoff between the 1961-1990 baseline period and two future time slices (2020s and 2070s) for the A2 scenarios (Alcamo et al., 2007).



# What will be the time-evolving regional/local climate changes (from now until 2099 and beyond) to which human societies will have to adapt?

⇒ **Post-AR4 climate change modeling paradigm:**

• **Decadal Prediction**

- Better regional predictions of weather and climate extremes
- Higher resolution, initialized AOGCMs
- To advise adaptation decisions

• **Longer Term Projections**

- New mitigation scenarios to address processes and feedbacks, e.g. carbon cycle
- Earth system models with intermediate resolution
- To advise mitigation and adaptation decisions

# Climate Prediction - Computing

A background image showing the silhouettes of two camels and a person walking across a desert landscape at sunset. The sky is a vibrant orange and red, with a large, bright sun low on the horizon. The silhouettes are dark against the bright sky.

**6. Climate prediction is one of the most computationally demanding problems.**

# Weather - Climate Continuum

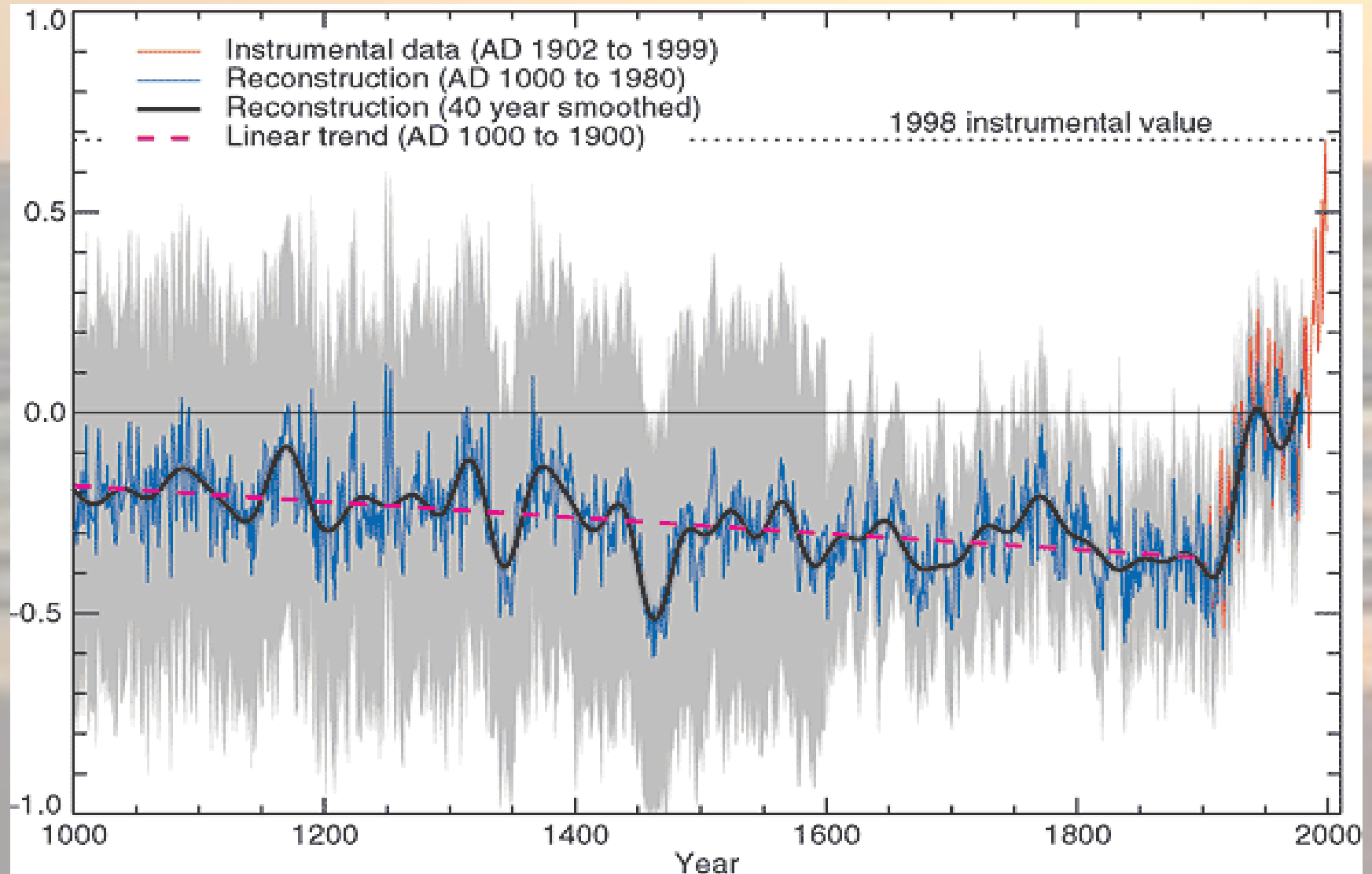
- Instead of predicting weather 15 days in advance, need to predict climate 10 years in advance
- Initial value problem at all lead-time scales
  - Need to initialize entire physical climate system (atmosphere, ocean, ice, land surface)
  - Need to assimilate Earth observations
- Multi-scale, multi-physics problem at all lead-time scales

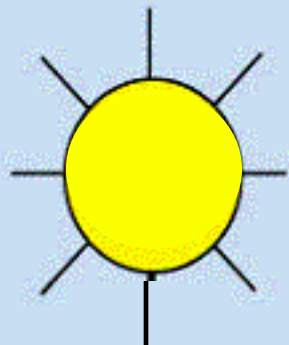
# Longer Runs





# Longer Runs





Atmosphere



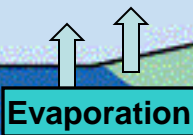
Clouds

Precipitation

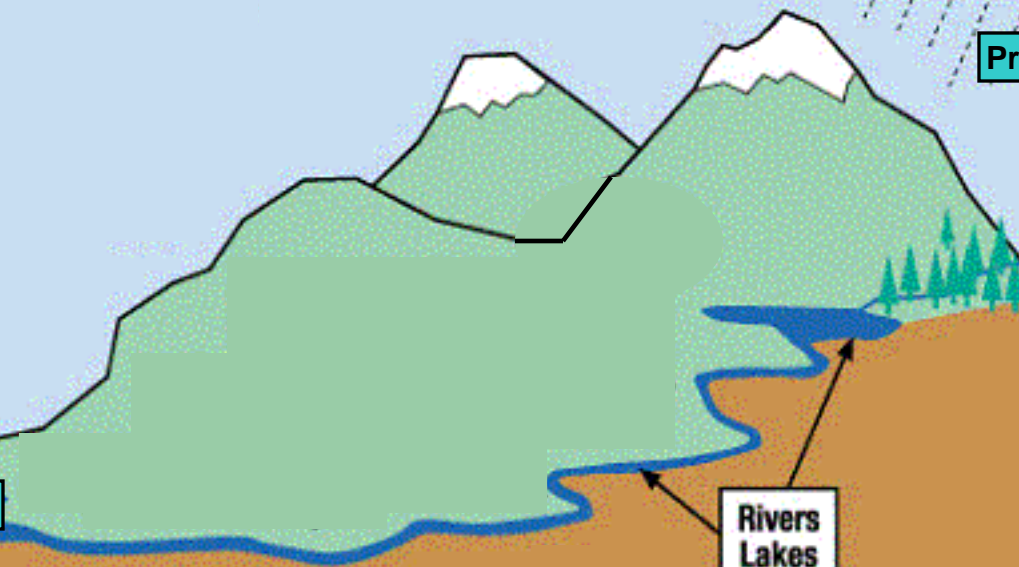


Sea-Ice

Oceans



Evaporation



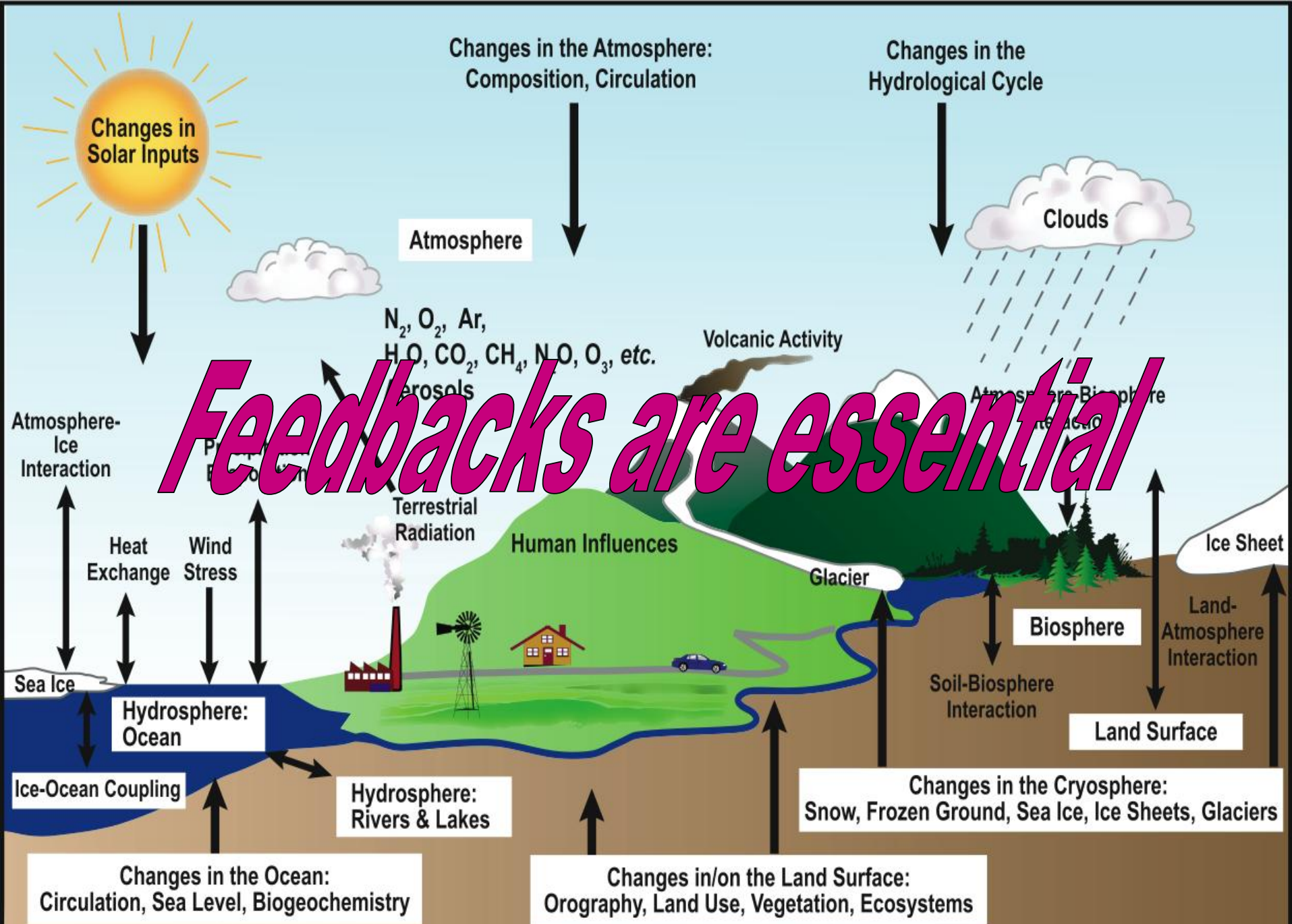
Land



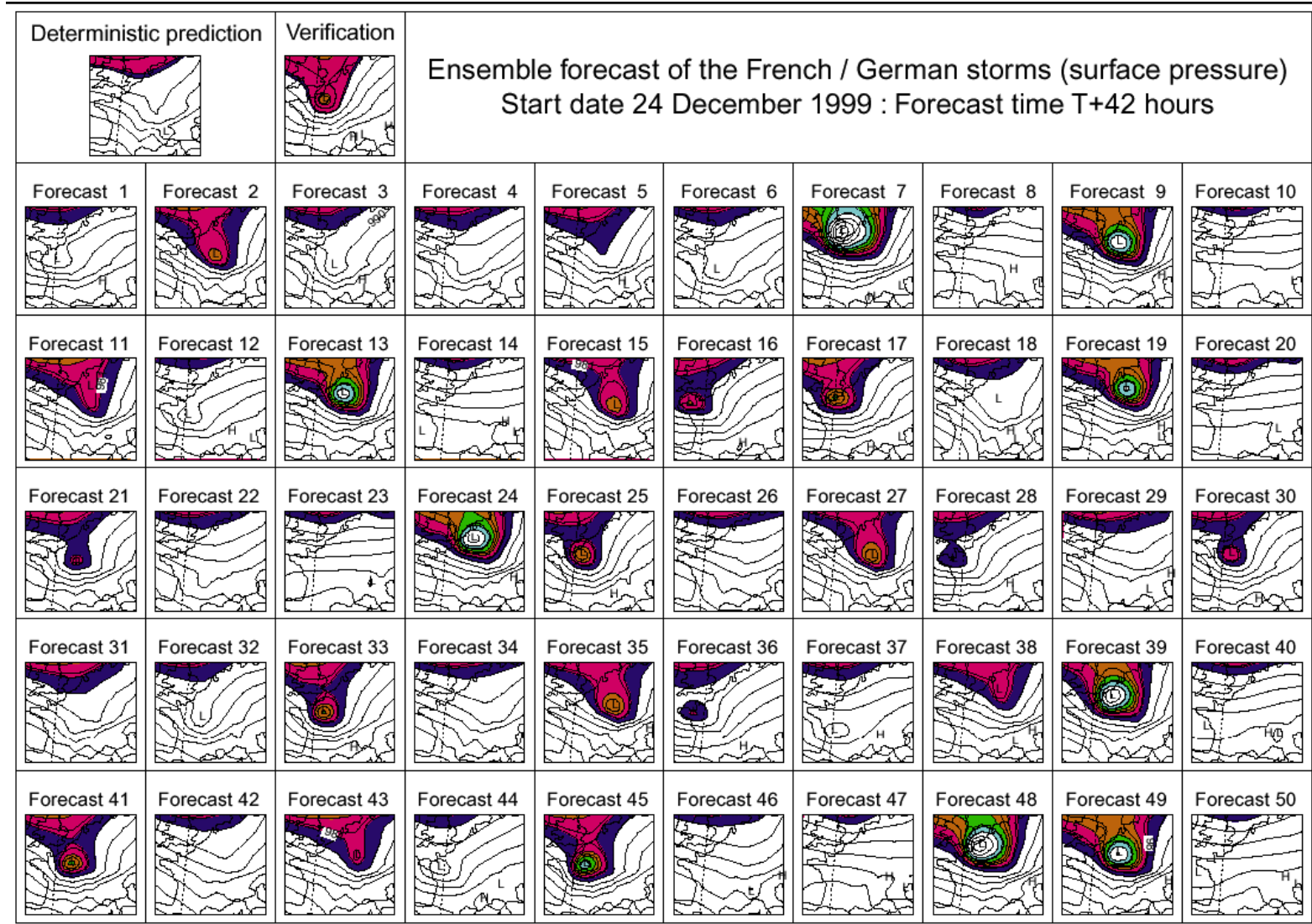
Rivers  
Lakes



Vegetation



# Ensembles





# Multi-Model Ensembles

## CMIP3 archive at PCMDI:

	Picntrl	PDcntrl	20C3M	Commit	SRESA2	SRESA1B	SRESB1	1%to2x	1%to4x	Slab cntl	2xCO2	AMIP
BCC-CM1, China												
BCCR-BCM2.0, Norway												
CCSM3, USA												
CGCM3.1(T47), Canada												
CGCM3.1(T63), Canada												
CNRM-CM3, France												
CSIRO-Mk3.0, Australia												
CSIRO-Mk3.5, Australia												
ECHAM5/MPI-OM, Germany												
ECHO-G, Germany/Korea												
FGOALS-g1.0, China												
GFDL-CM2.0, USA												
GFDL-CM2.1, USA												
GISS-AOM, USA												
GISS-EH, USA												
GISS-ER, USA												
INGV-SXG, Italy												
INM-CM3.0, Russia												
IPSL-CM4, France												
MIROC3.2(hires), Japan												
MIROC3.2(medres), Japan												
MRI-CGCM2.3.2, Japan												
PCM, USA												
UKMO-HadCM3, UK												
UKMO-HadGEM1, UK												

# Spatial Resolution

A background image showing the silhouettes of two camels and a person walking across a desert landscape at sunset. The sky is a vibrant orange and red, with a large, bright sun low on the horizon. The silhouettes are dark against the bright sky.

**7. The spatial scales of physical processes important to climate span almost 10 decades; from the global ( $10^7$  m) to the viscous ( $10^{-2}$  m), but even the largest climate models resolve less than 4 decades.**

**Spatial  
Resolution...**







# Spatial Resolution...

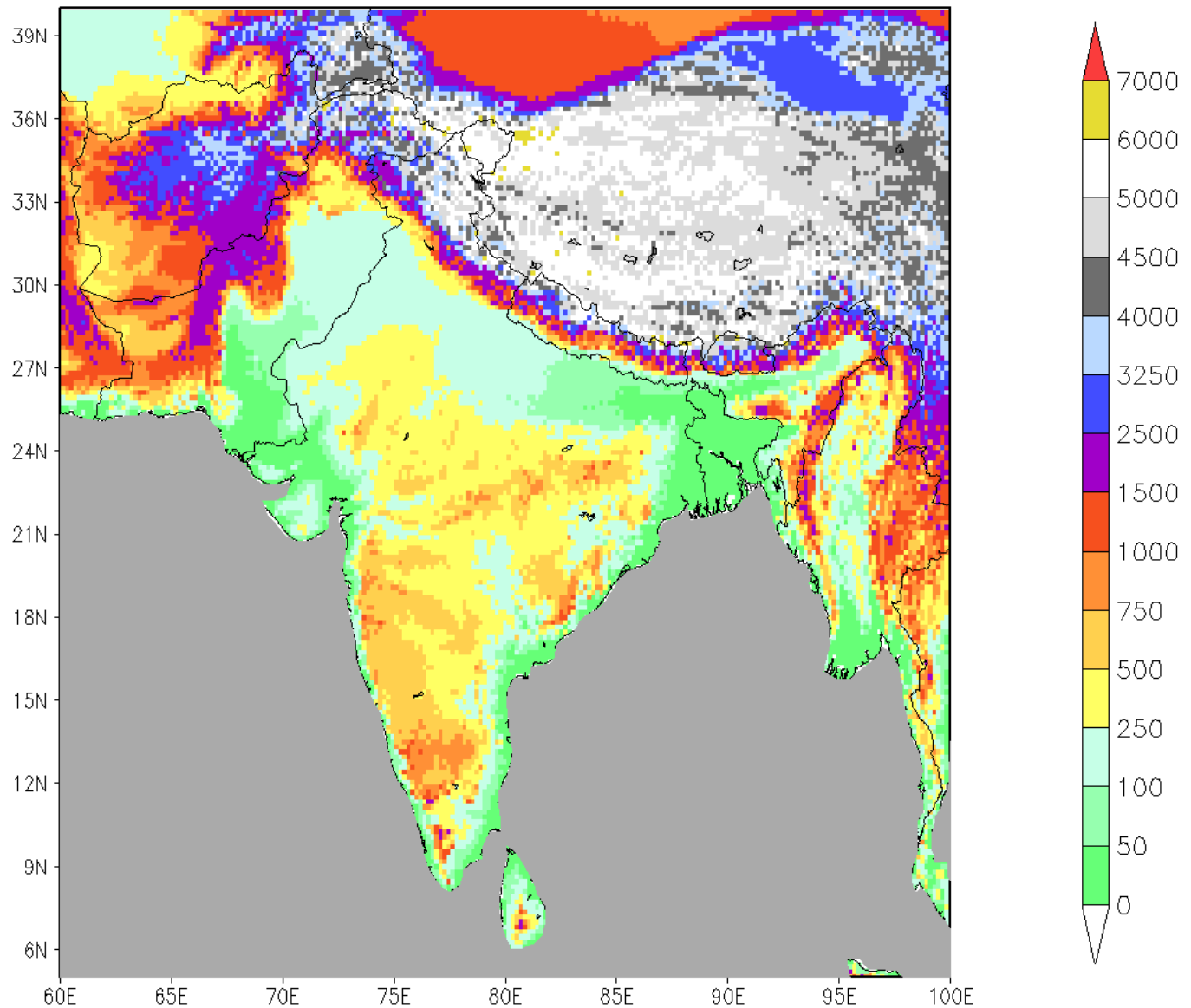
⇒ is required for:

- Accuracy
- Representation of features
- Representation of processes
- Scale interaction

⇒ drives computational demand

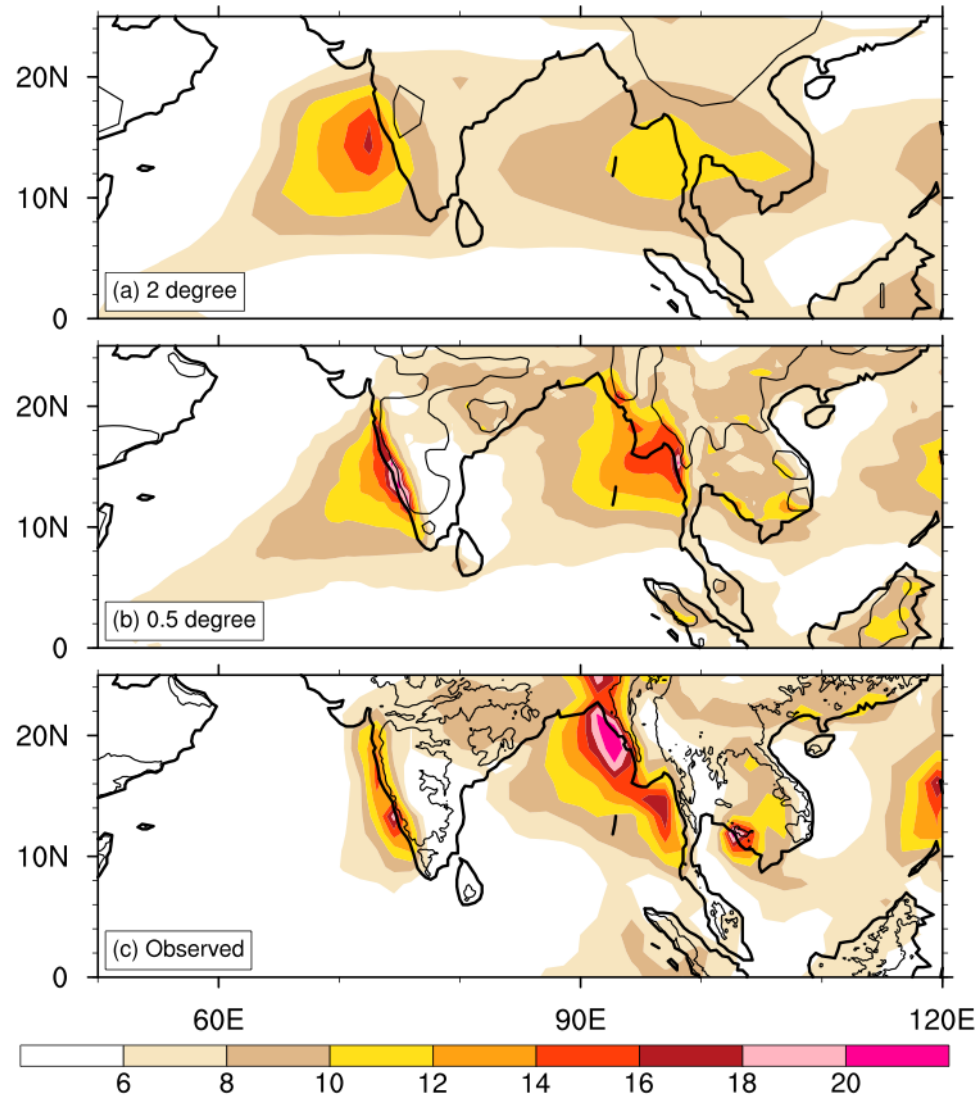


# Topography (m; res = 20km)



# CCSM

## CAM @ 0.5° + POP @ 1.0°



Gent et al. 2009 (*Clim. Dyn.*)

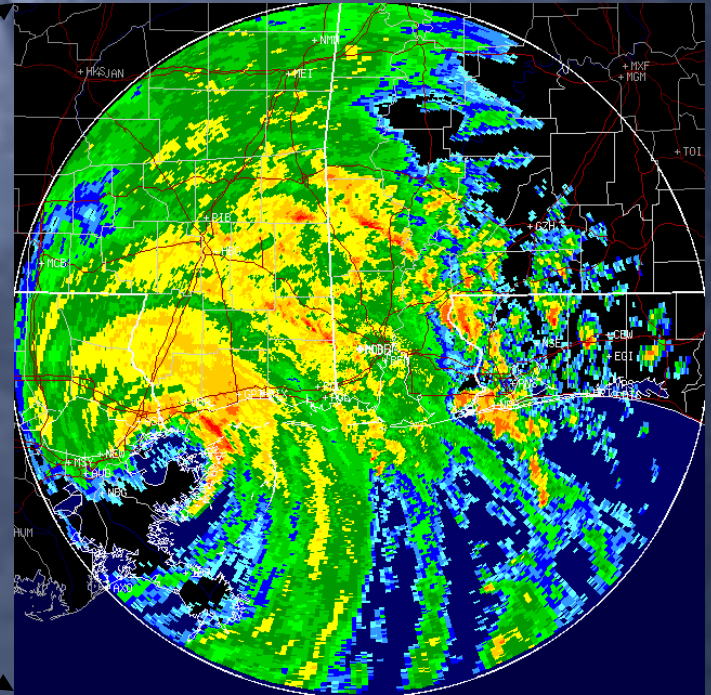
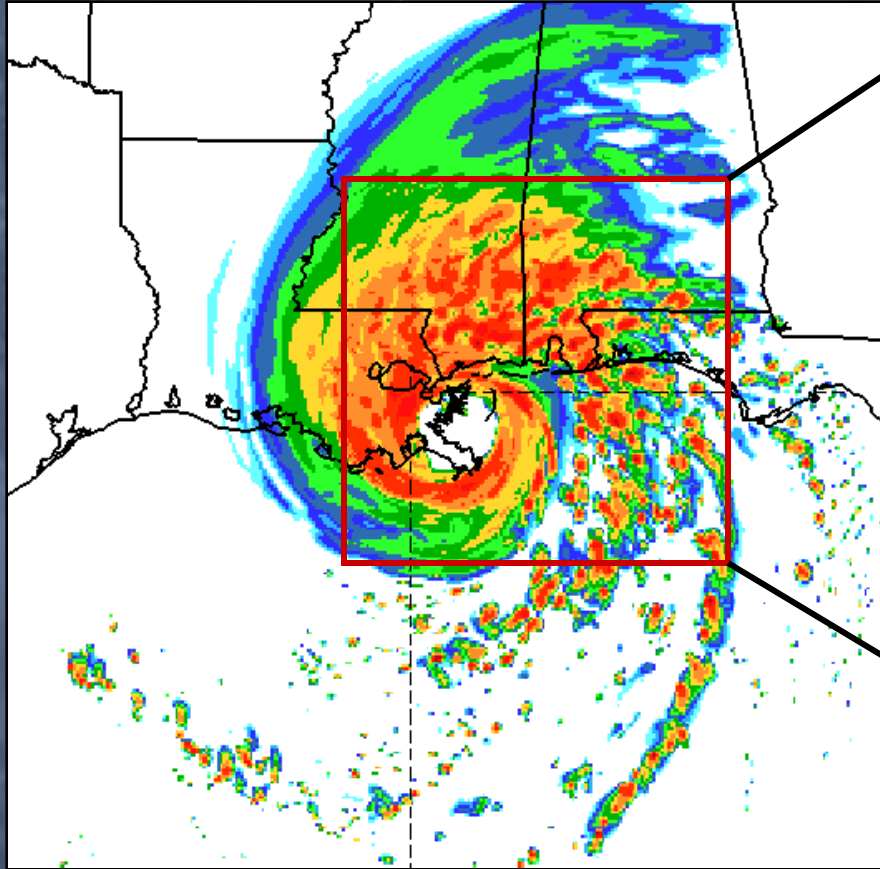
# Climate Problem: Predicting Tropical Cyclone Characteristics

- Frequency
- Regions affected (tracks)
- Intensity and areal extent (wind, waves, surge)
- Tornadoes!!
- Requires:
  - High model resolution
  - Improved physics
    - Cloud processes
    - Air-sea exchange
  - Combination of model and statistics

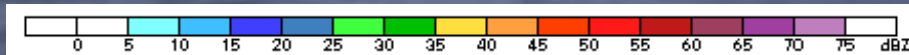
# *Hurricane Katrina Intensity at Landfall*

29 Aug 2005 14 Z

4 km WRF, 62 h forecast



Mobile Radar





A satellite image of the Earth showing the world's oceans and continents. Overlaid on the map are numerous thin, blue, wavy lines that represent oceanographic data, possibly sea surface temperature or salinity, extending across all major ocean basins. The text "Need Long Runs!" is superimposed in a large, bold, pink, italicized font across the center of the map.

***Need Long Runs!***

# Accuracy / Resolution Issues in the Atmosphere

- **Convective parameterization - when does it help? hurt?**
  - Convective parameterization tends to reduce strength of tropical storms, cloud time scale is key parameter; may be better off without CU parameterization (GMAO finding)
  - 35-km resolution needed to get seasonal cycle of tropical storm frequency (NCEP finding)
  - Crossover resolution at which no CU parameterization is better may be ~ 20 km (GFDL hypothesis)
  - Evidence that cloud-resolving models are qualitatively different ...
- 50-km or even 25-km resolution is needed to get statistics of extratropical winter storms right (ECMWF finding)
- 17-km resolution may be required to get important extreme events in extratropics right (ECMWF finding)

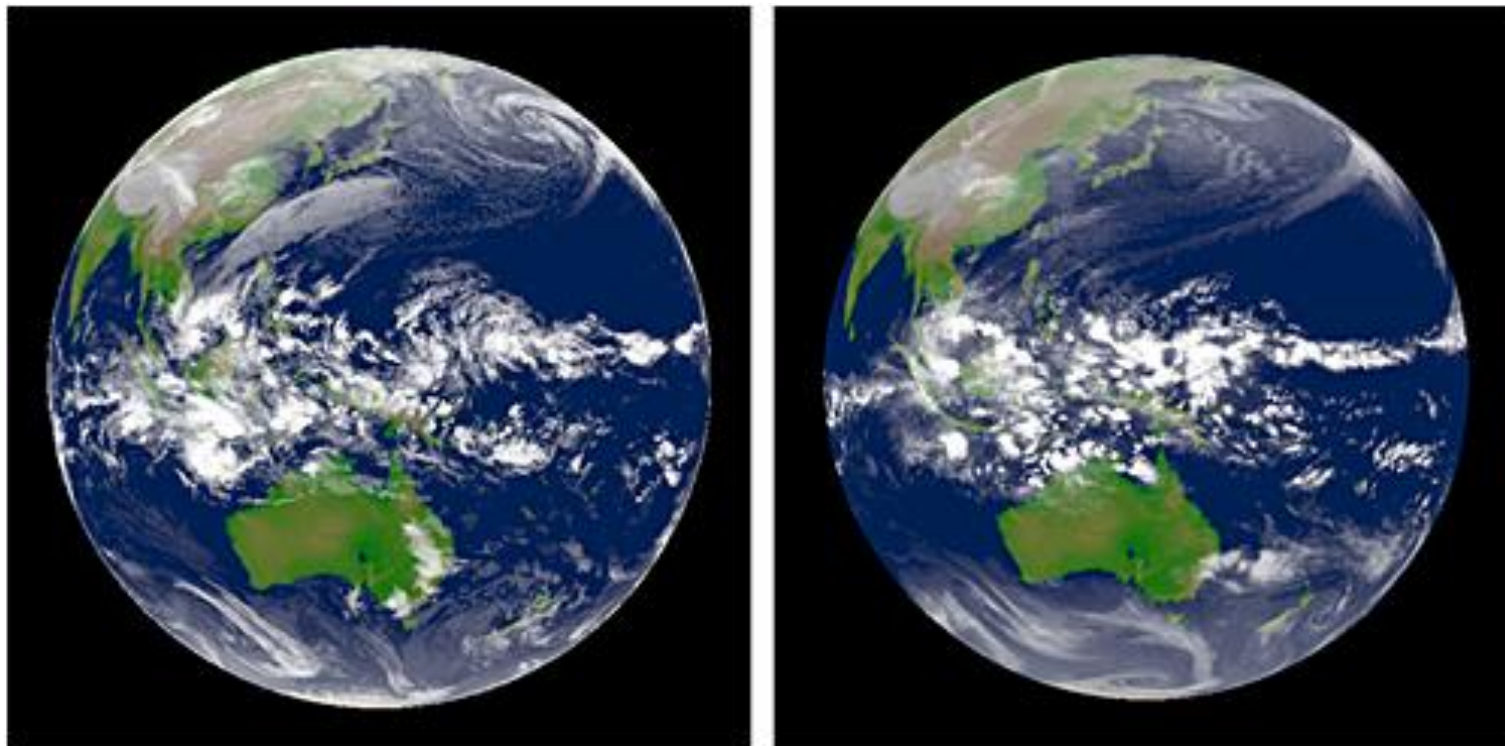


An aerial photograph showing a vast, intricate cloud system. The clouds are dense and white, with some areas appearing more puffy and others more wispy. They are set against a dark, almost black background that represents the ground or water below. The lighting is bright, creating strong highlights on the cloud tops and deep shadows in the surrounding areas. The overall composition is dynamic and emphasizes the scale and complexity of the atmospheric phenomenon.

*Need Process-Resolving Models!*



# Global Cloud-System Resolving Model (NICAM)



Snapshot of 00UTC31Dec2006 cloud distribution in satellite image (left) and 3.5-km NICAM simulation (right)

Miura et al., 2007



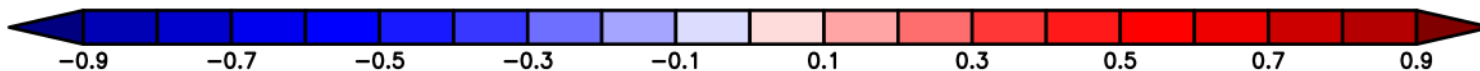
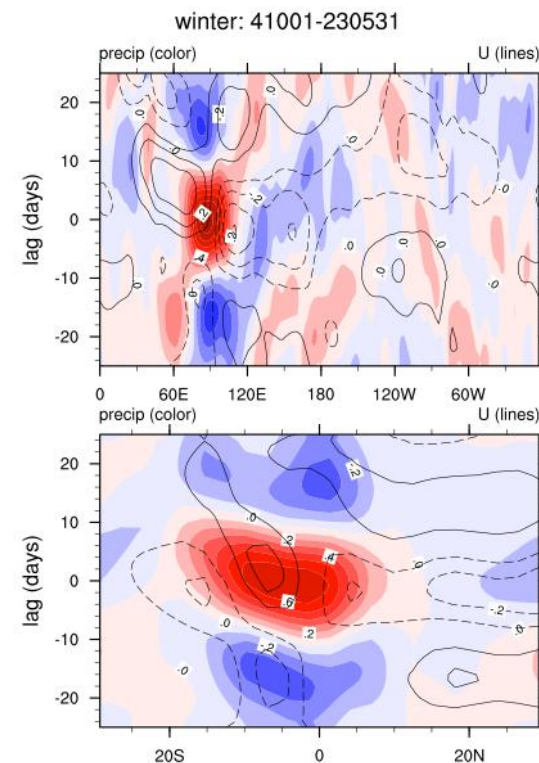
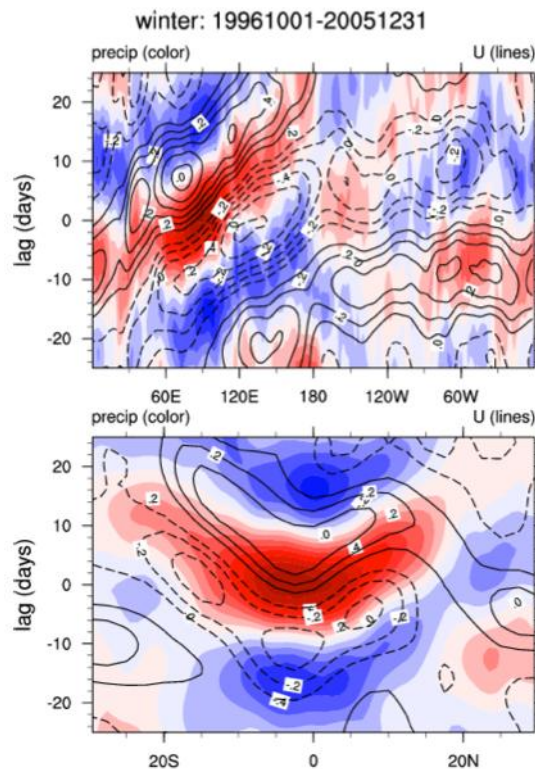
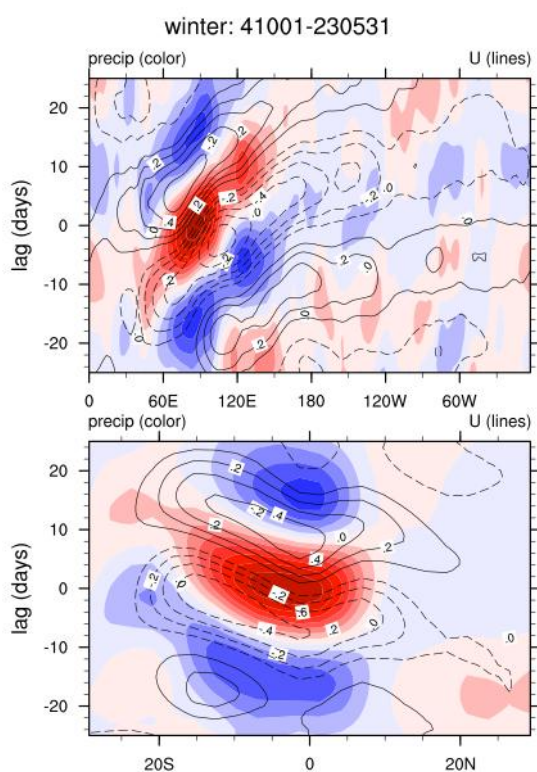
# MJO Simulation

(Winter, 20-100 bandpass)

## SP-CCSM

## GPCP/NCEP

## CCSM



Courtesy Cristiana Stan, COLA

# Accuracy / Resolution Issues in the Atmosphere

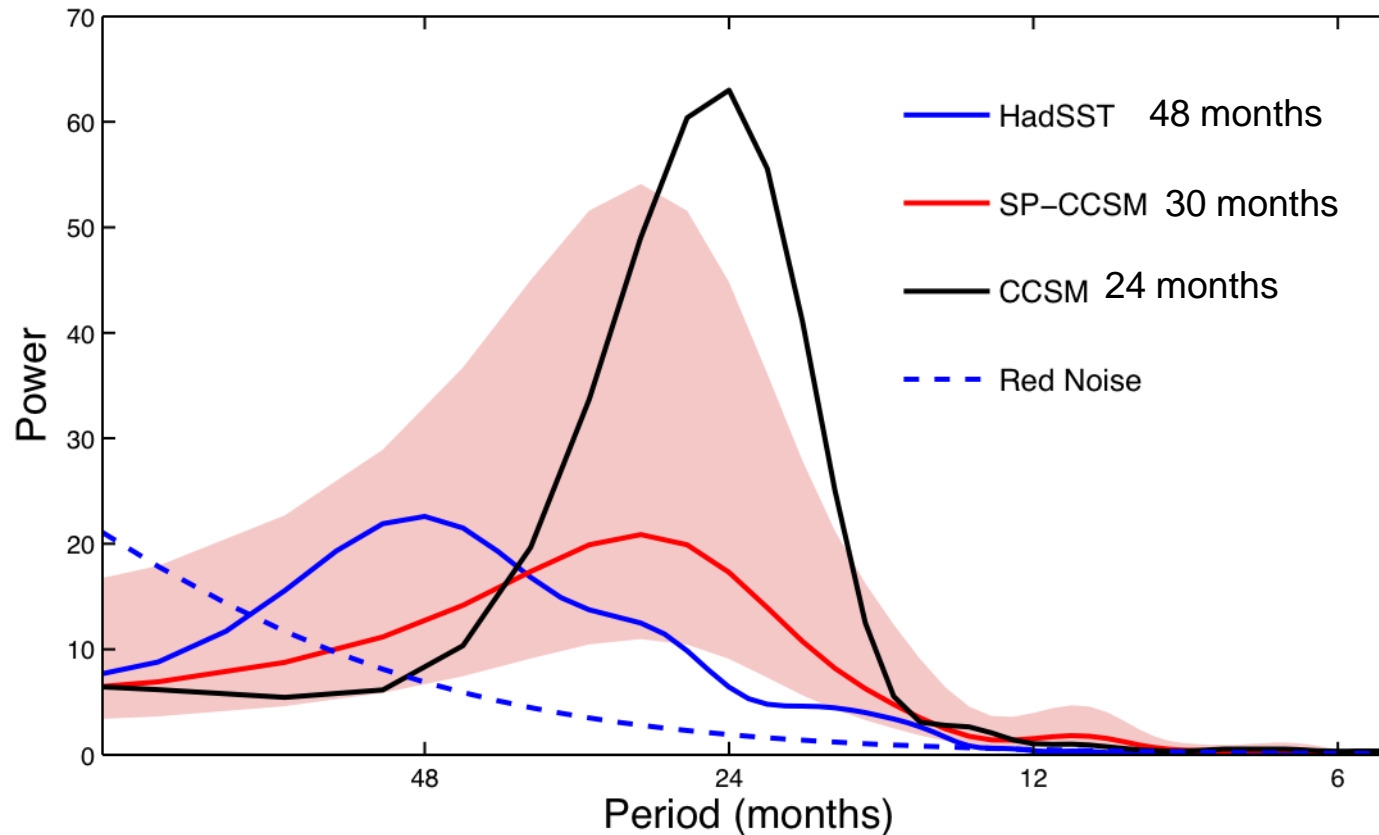
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# Does Resolution Help with ENSO Features?

- Mean Climate - Tropical mean SST, precipitation
- Equatorial Pacific SST annual cycle
- NINO3.4 - **Power spectrum**, amplitude, phase w.r.t. annual cycle, correlation with wind stress, correlation with global SST
- ENSO events - Duration, propagation of SST anomalies, evolution of tropical Pacific thermocline
- Linkage to Subseasonal Variability
- Teleconnections - ENSO-monsoon correlation, mid-latitude stationary waves

# ENSO Simulation

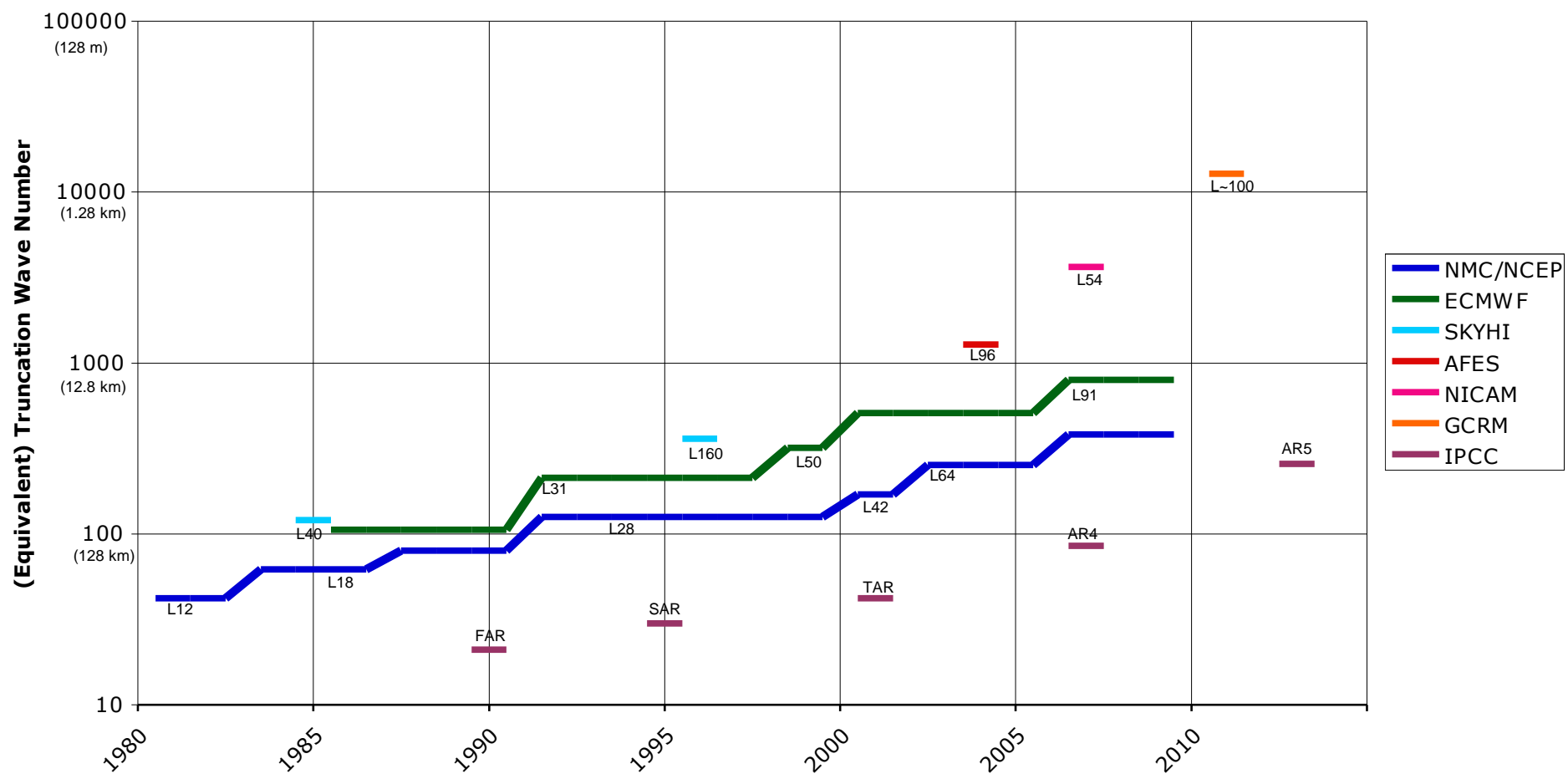
## NINO3.4 (5S-5N,170W-120W)



Courtesy Cristiana Stan, COLA

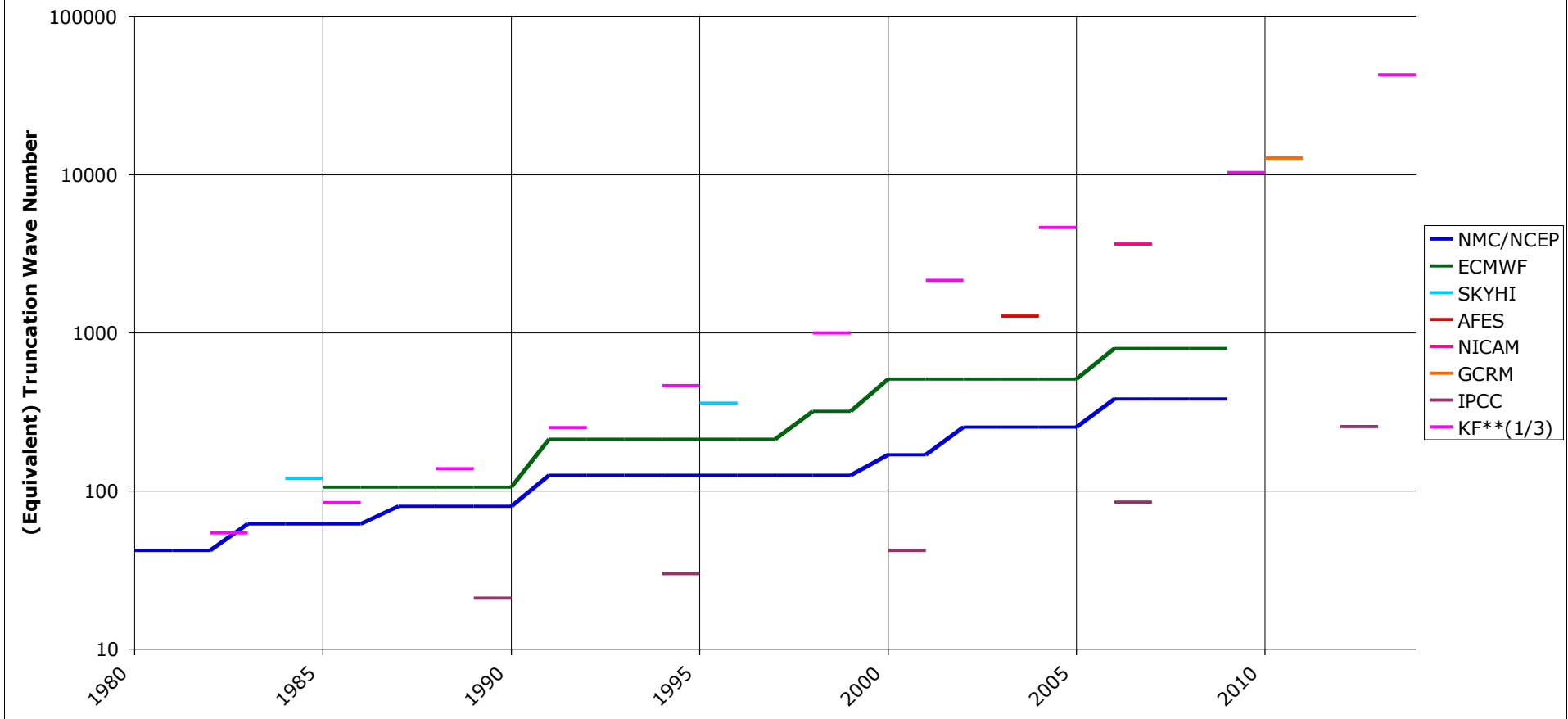


## Global Atmospheric Models Horizontal Resolution



a la Kevin Hamilton (IPRC, 2009)

## Global Atmospheric Models Horizontal Resolution

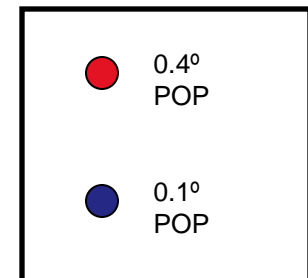
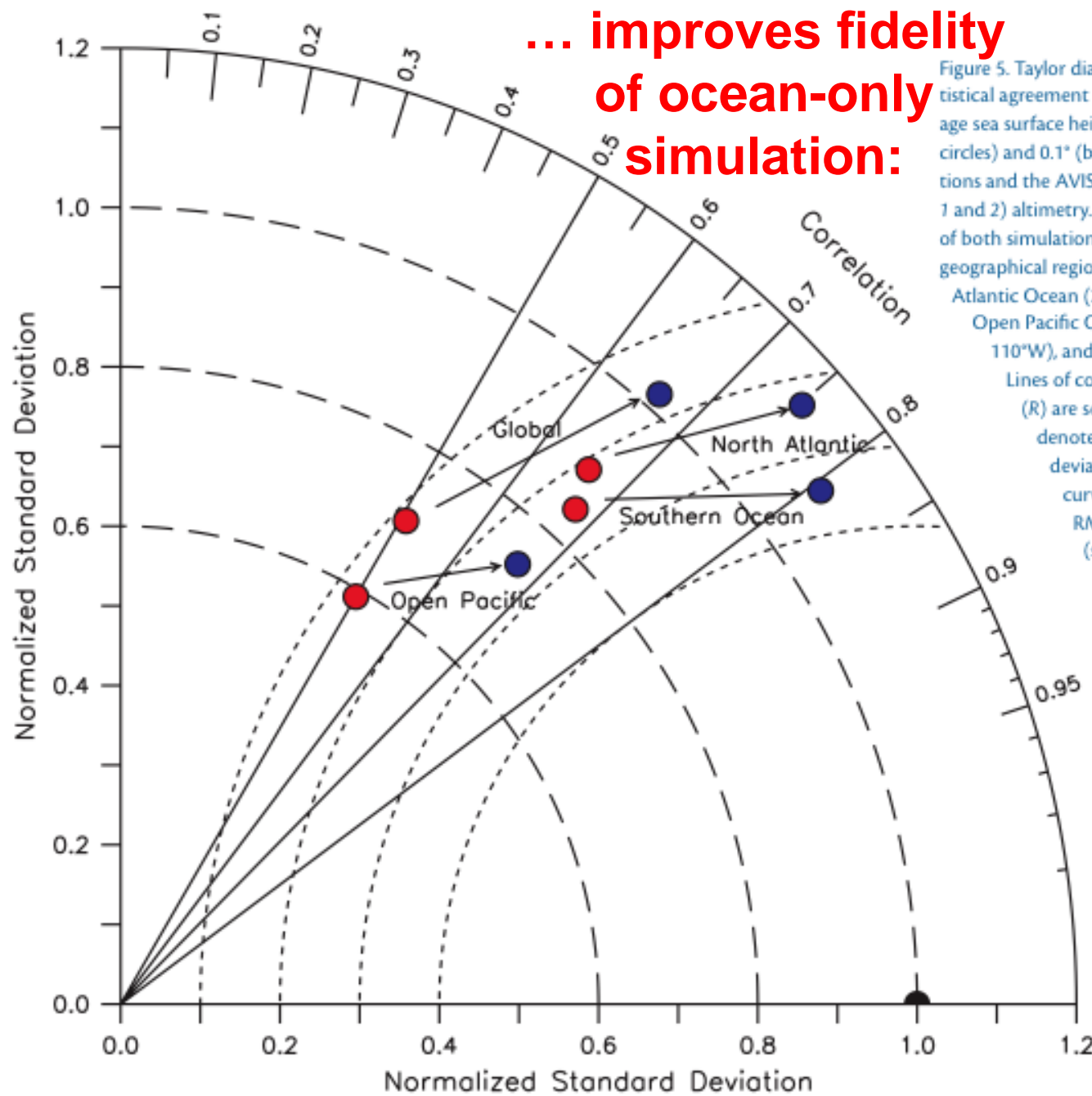


# How Does Resolving the Ocean Circulation Help?

- Typical global ocean models used for climate prediction “permit” eddies, at best
- To “resolve” eddies, need grid spacing less than 10 km (ocean modelers achieved this ~10 years ago)
- What is the impact of resolving the ocean eddies?

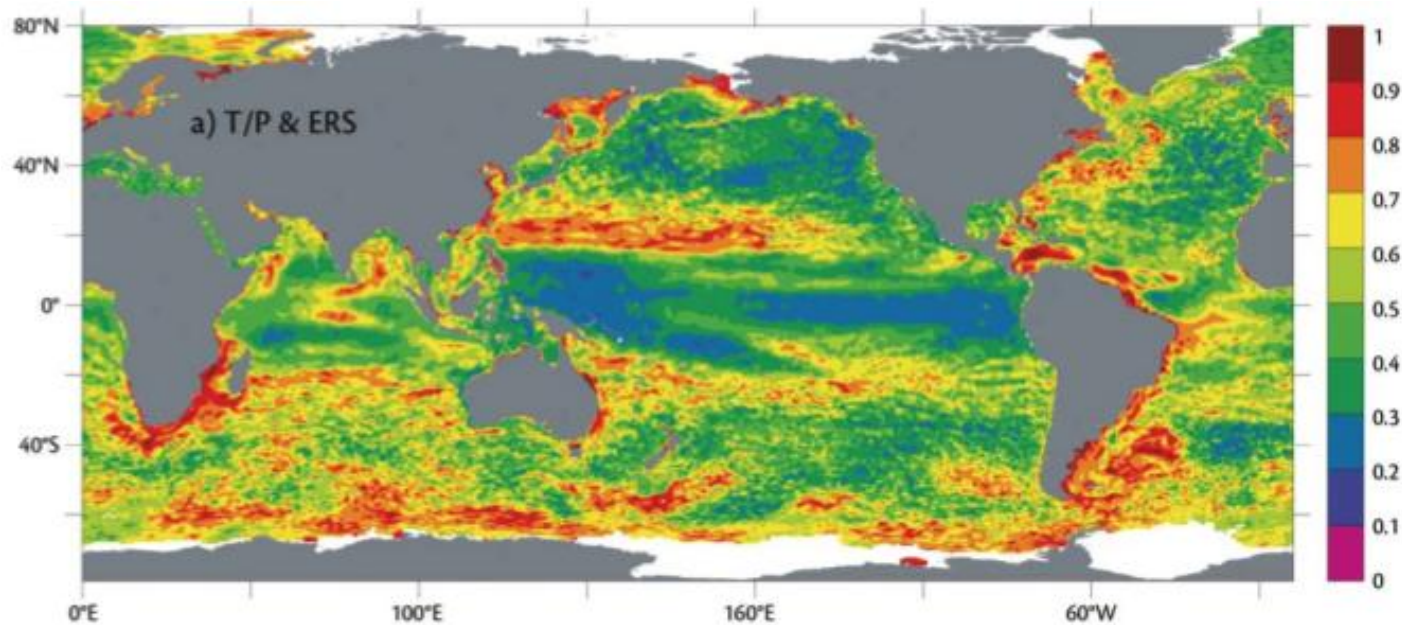
# ... improves fidelity of ocean-only simulation:

Figure 5. Taylor diagram showing the level of statistical agreement between the 1994–2001 average sea surface height anomaly from the 0.4° (red circles) and 0.1° (blue circles) global POP simulations and the AVISO (TOPEX/POSEIDON and ERS 1 and 2) altimetry. The arrows connect the results of both simulations evaluated over the following geographical regions: Global (70°S–70°N), North Atlantic Ocean (20°N–55°N, 100°W–20°W), Open Pacific Ocean (30°S–30°N, 150°E–110°W), and Southern Ocean (65°S–40°S). Lines of constant correlation coefficient ( $R$ ) are solid; the long dashed curves denote lines of constant standard deviation ratio ( $\sigma$ ); the short dashed curves denote lines of constant RMS difference, varying from 0.6 (small radius) to 0.9 by 0.1. The black semicircle represents the location of perfect agreement between the simulation and the comparison data set.

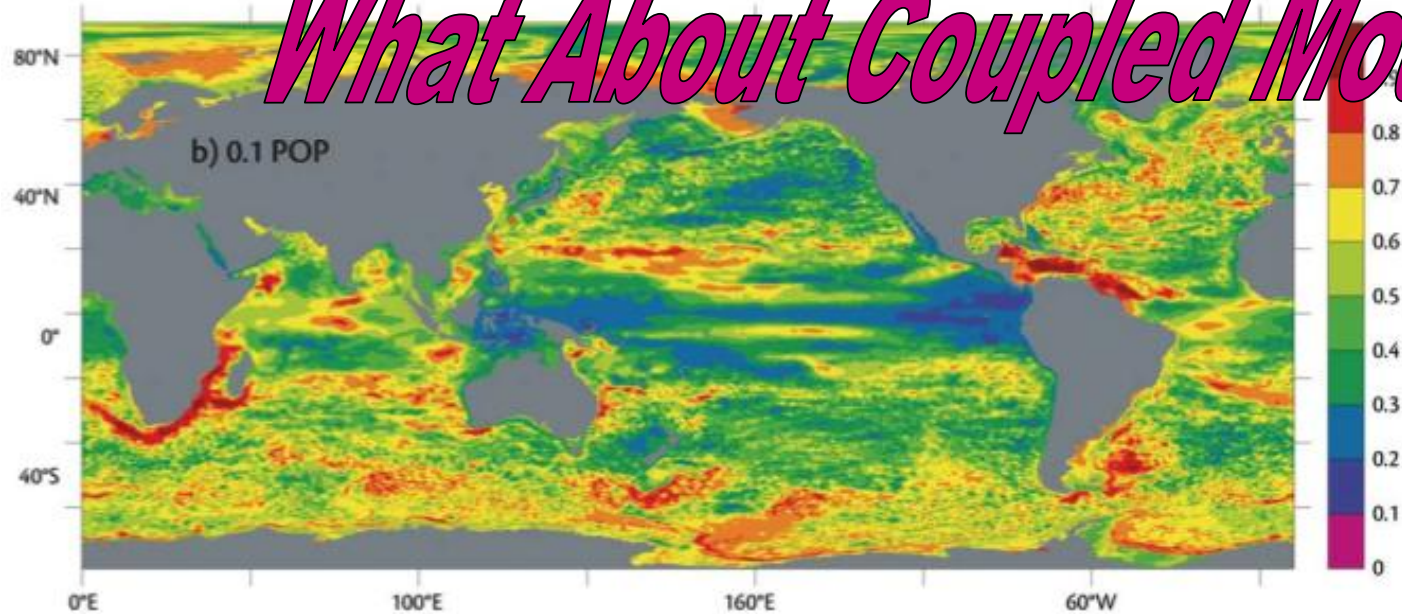


McClellan, J. L., M. E. Maltrud, and F. O. Bryan, 2006: Measures of the fidelity of eddying ocean models. *Oceanography*, **19**, 104-117.





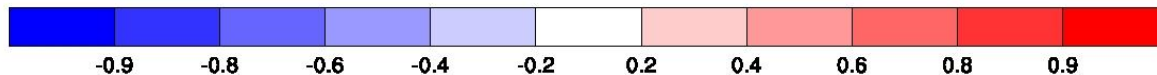
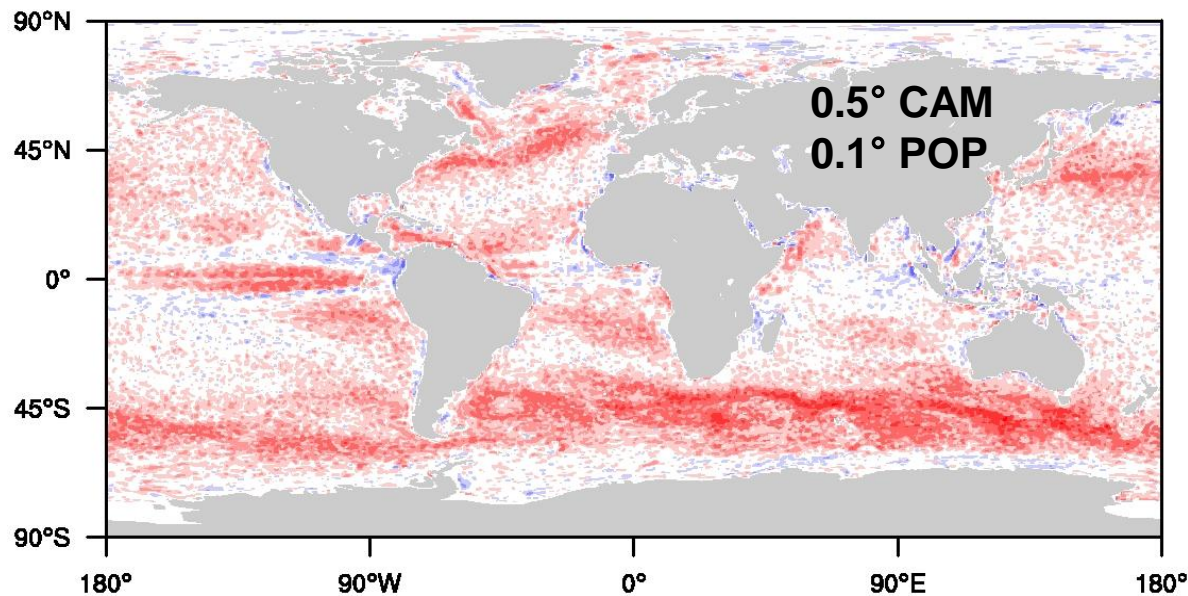
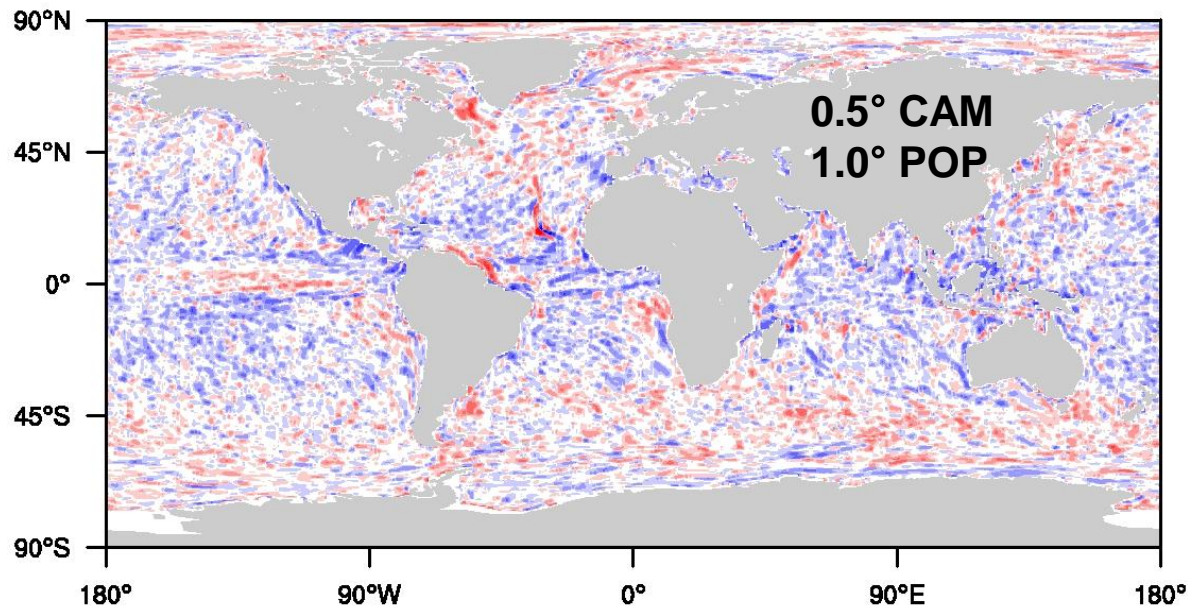
# *What About Coupled Models?*



Mesoscale: Total RMS SSHA Ratio

McClean, J. L., M. E. Maltrud,  
and F. O. Bryan, 2006:  
Measures of the fidelity of  
eddying ocean models.  
*Oceanography*, **19**, 104-117.

# Correlation High-Pass SST vs. $|V_{srf}|$



Next-generation global coupled climate models will enter a qualitatively different (and more realistic) dynamical regime.

Courtesy Fran Bryan, NCAR



[illegible]

# Computing Capability

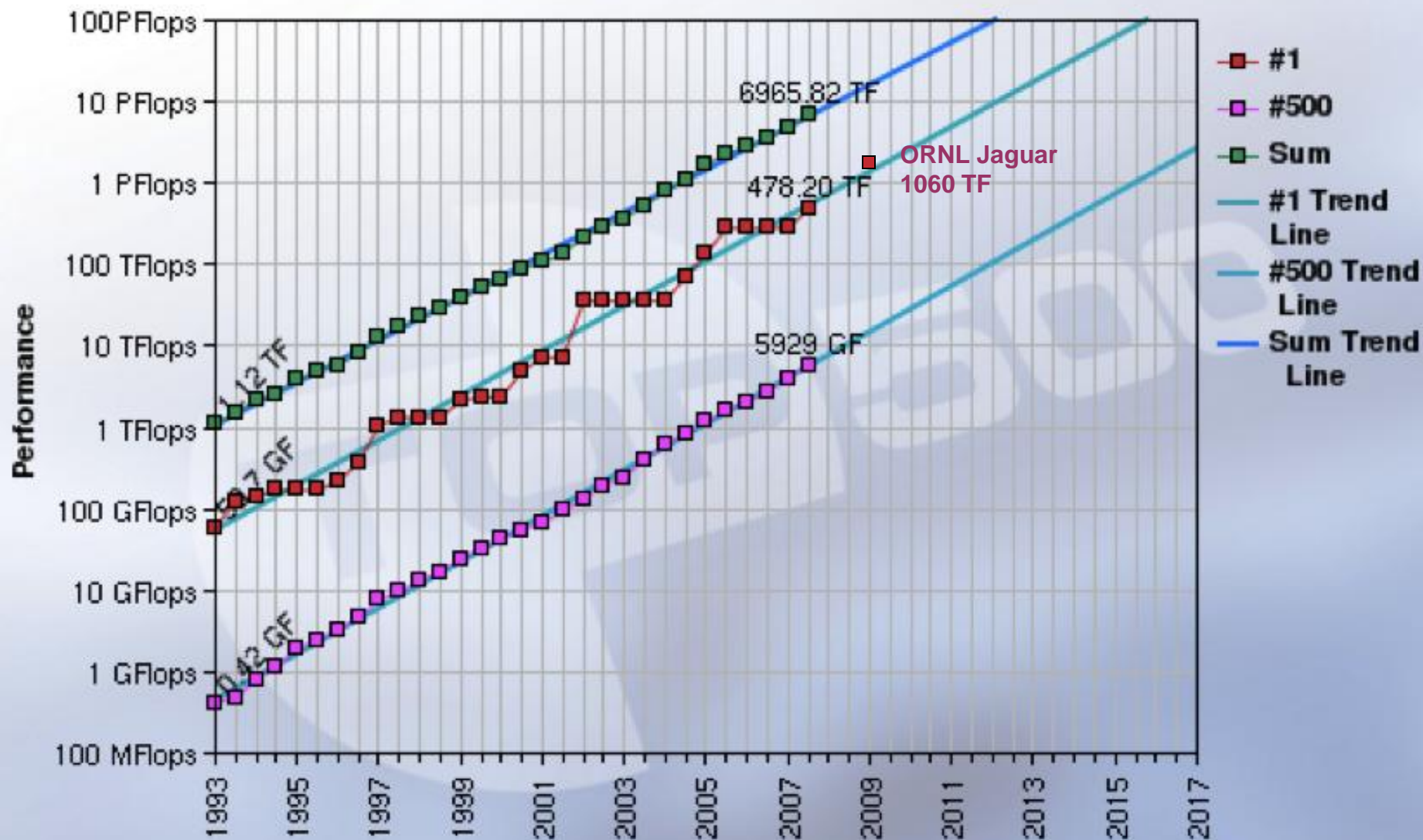
A background image showing the silhouettes of two camels and a person walking across a desert landscape at sunset. The sky is a vibrant orange and red, with a large, bright sun low on the horizon. The silhouettes are dark against the bright sky.

**8. It is possible that, within the next 6 years, high-end computers will have**

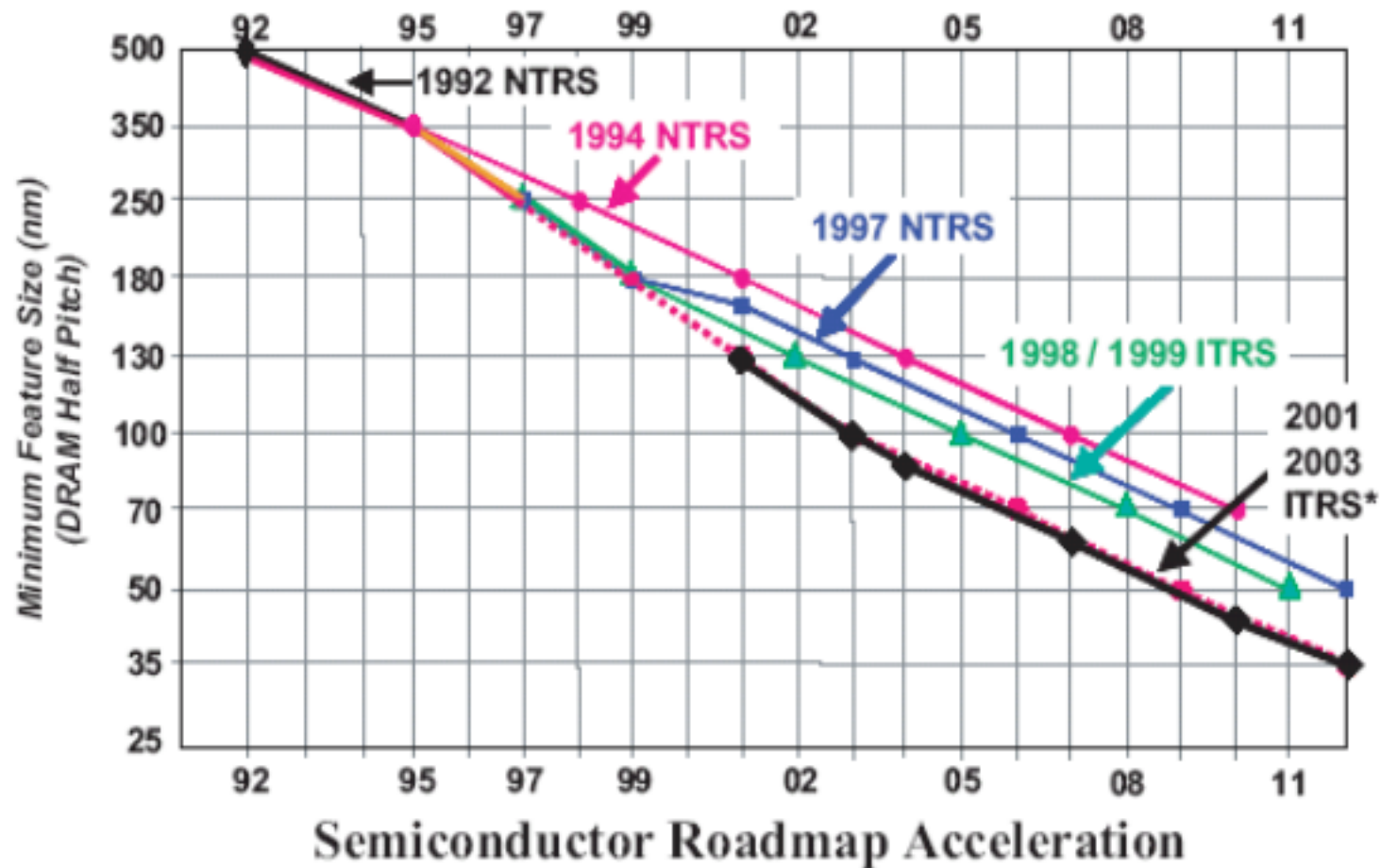
- peak capability of 100 petaflops ( $10^{17}$  floating point operations per second)**
- Tens of millions of computing units**



# Aggregate Computing Capability Still Rising



# Feature Size Decreasing: $-14\% \text{ yr}^{-1}$

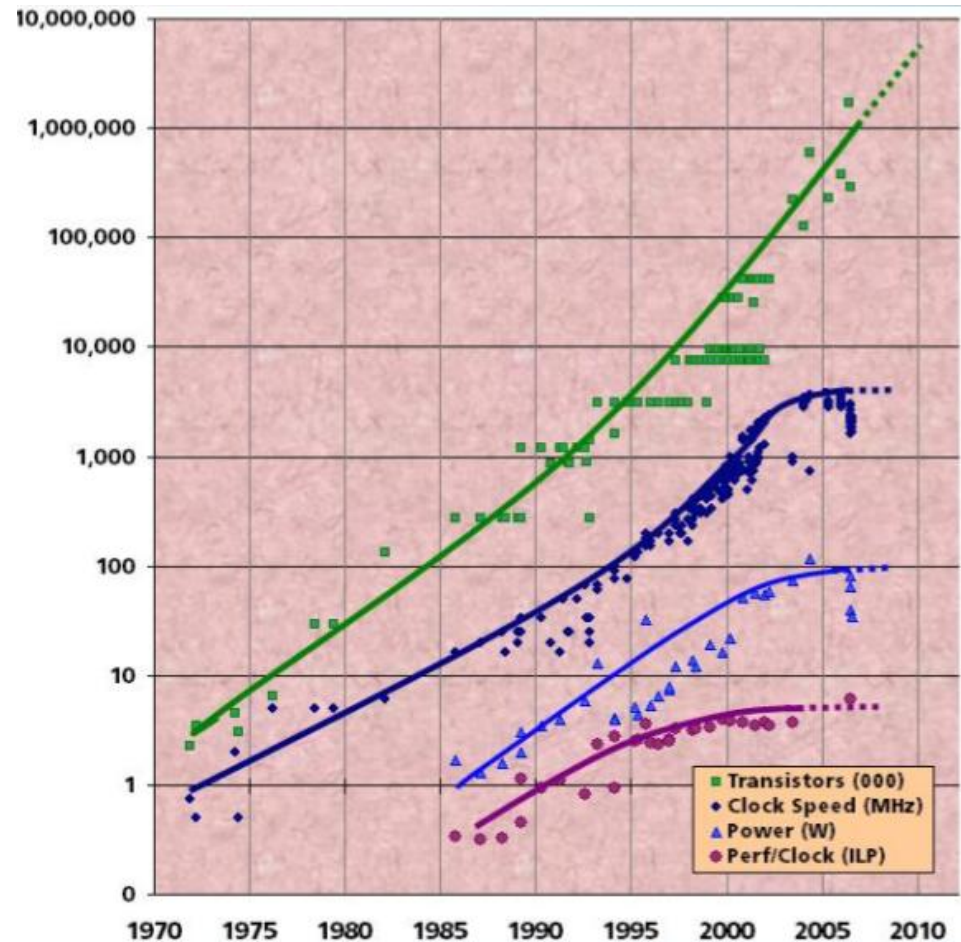


\*Note the 2003 ITRS timing is unchanged from the 2001 ITRS

Courtesy Rich Loft, NCAR

# Clock Speed - Flattening

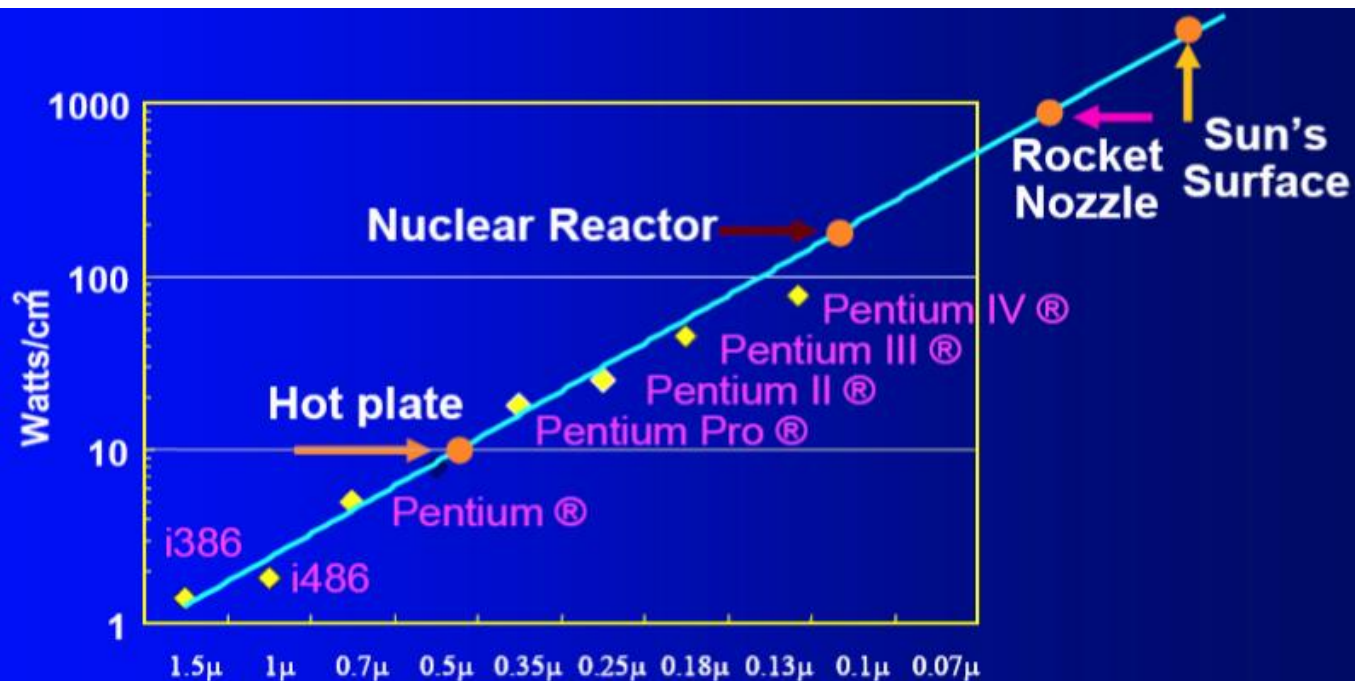
- Chip density increasing @ 2X per 2 years
  - Clock speed is not
  - Cores/chip doubling instead
- Hidden parallelism - little or none remaining potential
- → Parallelism via software



Courtesy Rich Loft, NCAR



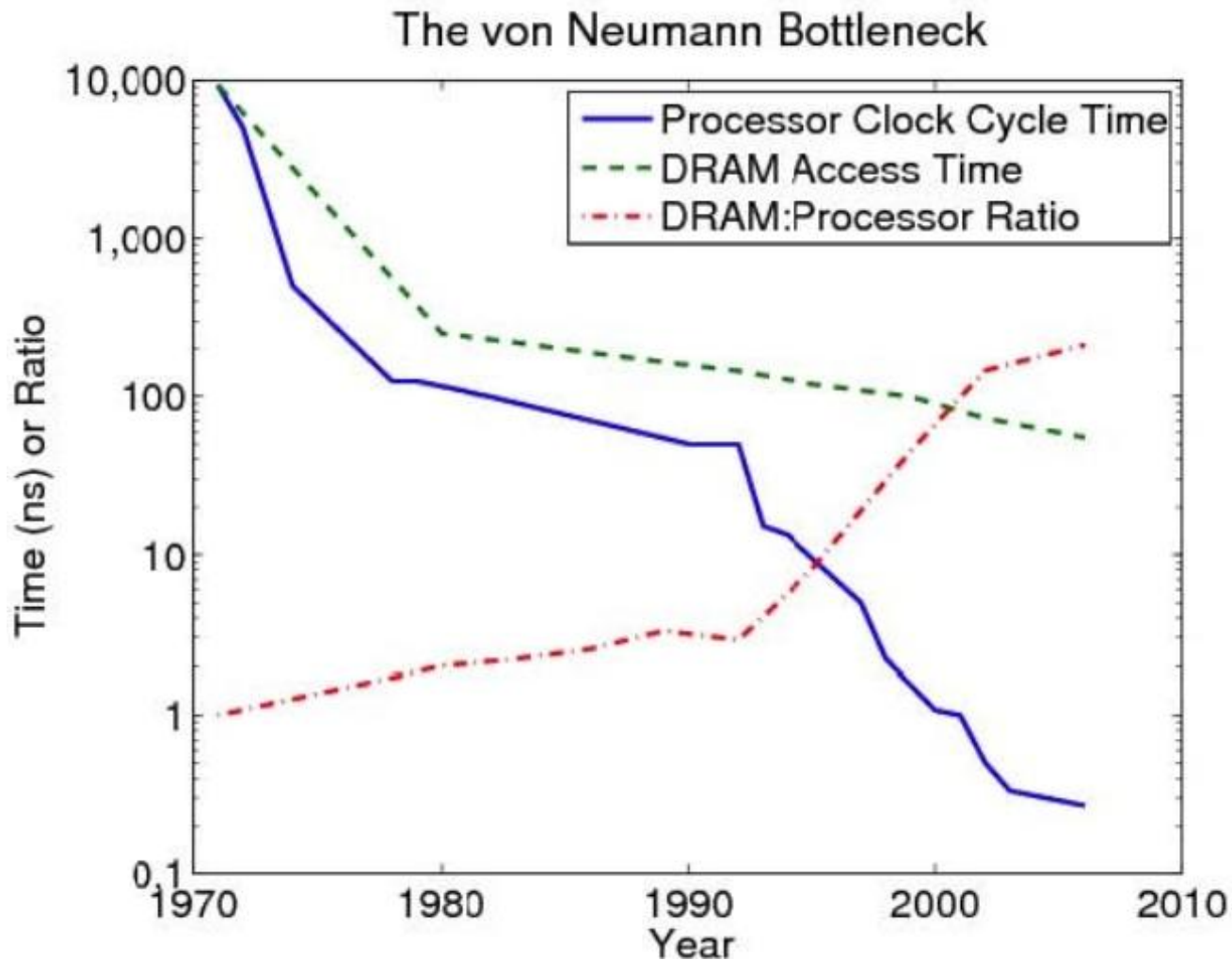
# Power Density Rising Relentlessly



- 80% increase in power density/generation
- Voltage scales by ~0.8
- 225% increase in current consumption/unit area !

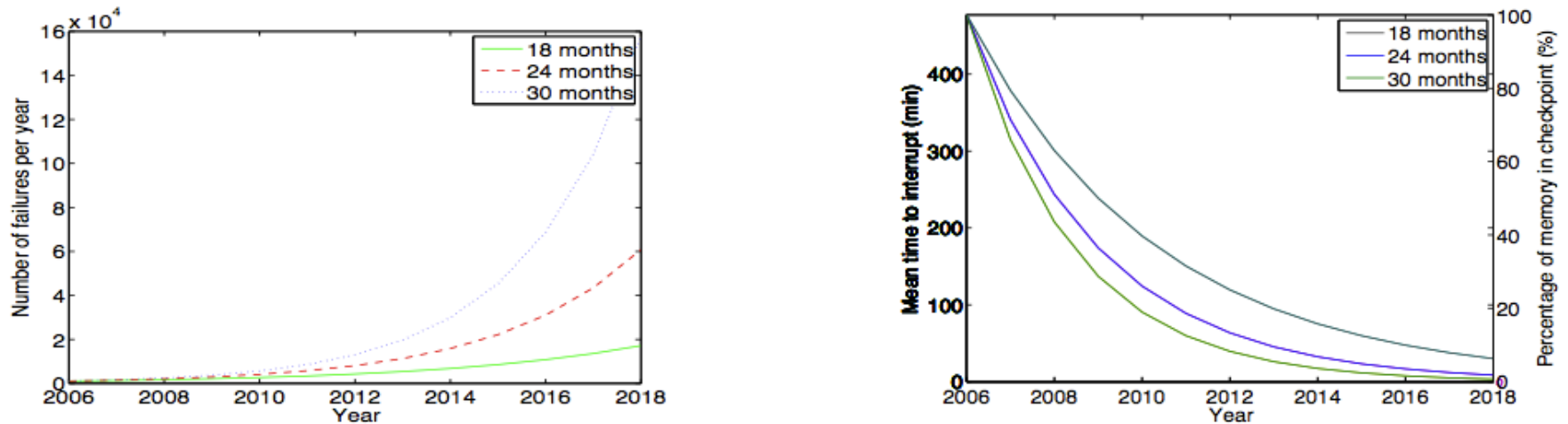
Source: Shekhar Borkar. Intel

# Memory: Hitting a Wall



Courtesy Rich Loft, NCAR

# Understanding Failures in Petascale Computers

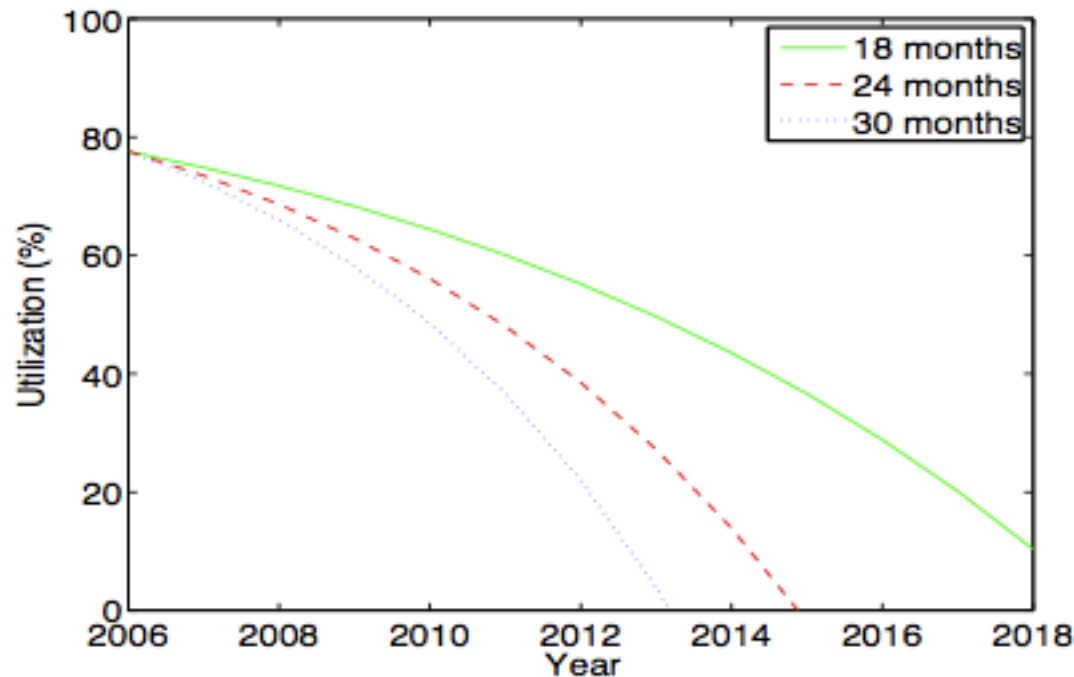


**Figure 4.** The expected growth in failure rate (left) and decrease in MTTFI (right), assuming that the number of cores per socket grows by a factor of 2 every 18, 24 and 30 months, respectively, and the number of sockets increases to stay on top500.org.

Schroeder and Gibson, J. Comp. Phys. (2007)



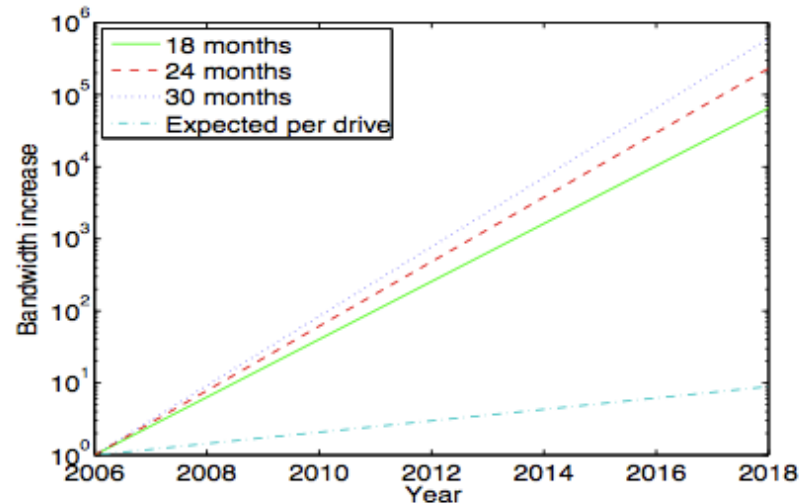
# Understanding Failures in Petascale Computers



**Figure 5.** Effective application utilization over time.

Schroeder and Gibson, J. Comp. Phys. (2007)

# Understanding Failures in Petascale Computers



**Figure 6.** The growth in bandwidth necessary to make checkpoints cheap enough to compensate for the increased failure rate due to growth in number of sockets, assuming the number of cores per socket grows by a factor of 2 every 18, 24 and 30 months, respectively.

Schroeder and Gibson, J. Comp. Phys. (2007)

# Current State of (US) Petascale Systems

- Los Alamos Roadrunner (IBM) - 1.6 PFLOPS
  - 16K Opteron cores
  - 128K Cell SPEs
- LLNL BlueGene (IBM) - 1.0 PFLOPS
  - 65K powerPC cores
- ORNL Jaguar (Cray XT5) - 1.0 PFLOPS
  - 150K Opteron cores (Barcelona quads) \*
- NASA Ames Pleiades (SGI Ice) - 0.6 PFLOPS
  - 51K Xeon cores (Harpertown and Clovertown quads)
- NICS Kraken (Cray XT5) - 0.6 PFLOPS
  - 66K Opteron cores (Barcelona quads) \*
- NCSA Blue Waters (IBM) - 10 PFLOPS (2011)
  - 320K Power7 cores (octacores?)

\* Being upgraded to Istanbul hexa-cores in 2009

# Kraken XT-5 at NICS



Courtesy of Pat Kovatch, NICS

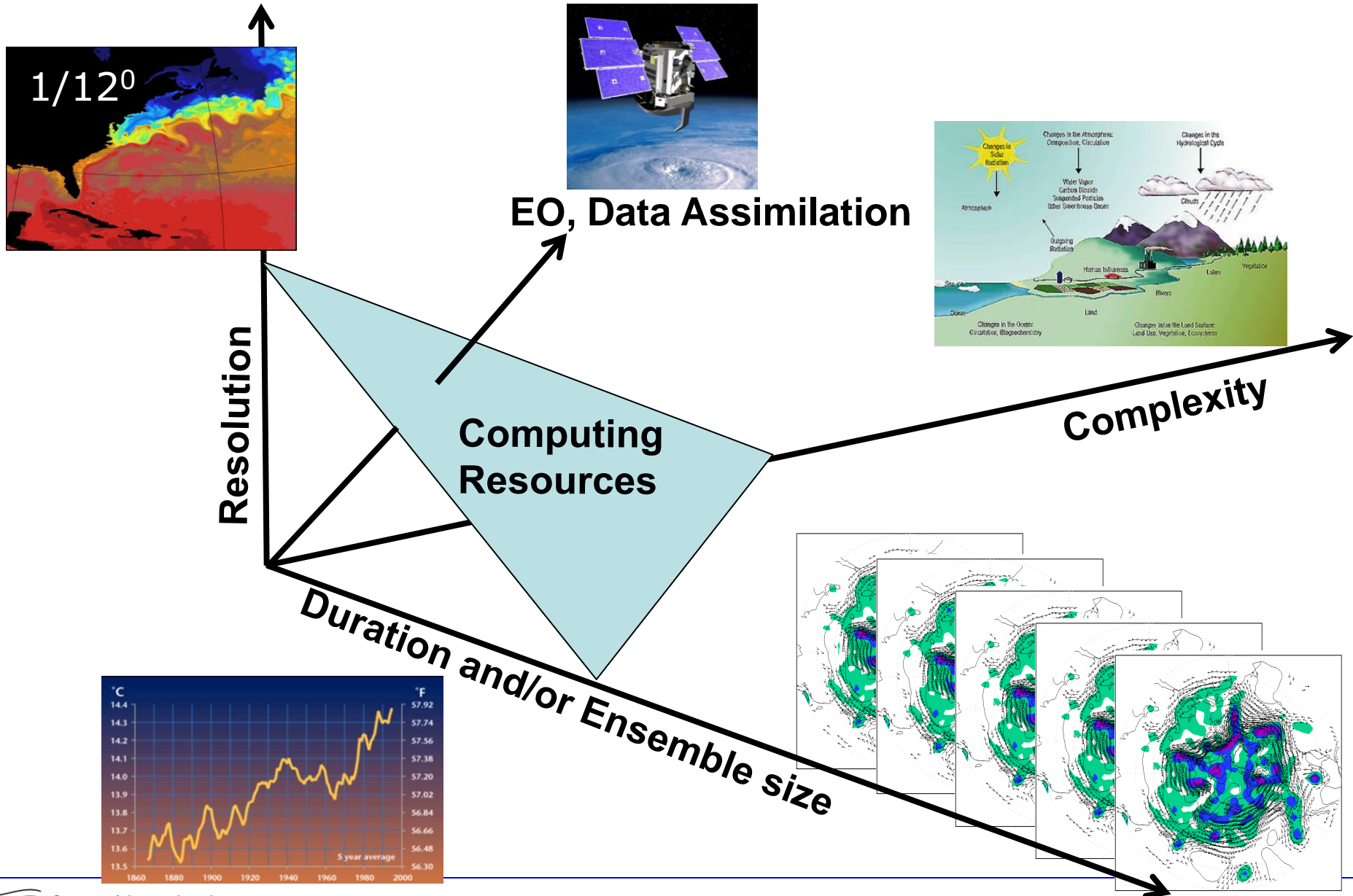


# Likely Platform in 2015

- 22 micron feature size (Moore's "law")
- Heterogeneous architecture
  - ~32 million heavyweight processors
  - ~8 million light-weight processors (e.g. GPU)
  - Two decades experience with communicating-sequential-processes execution model and message-passing programming model --> community is ill-prepared for new era of heterogeneous multi-core platforms
- 16 PB memory
- 100 PFLOPs peak performance
  - 75% sustained on high-performance Linpack
  - What percentage will fluid dynamics codes sustain?
- 22 MW power requirement

Courtesy Thomas Sterling, LSU

# Balancing Future Demands on Computing Power



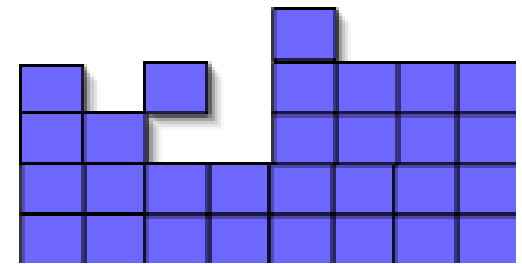
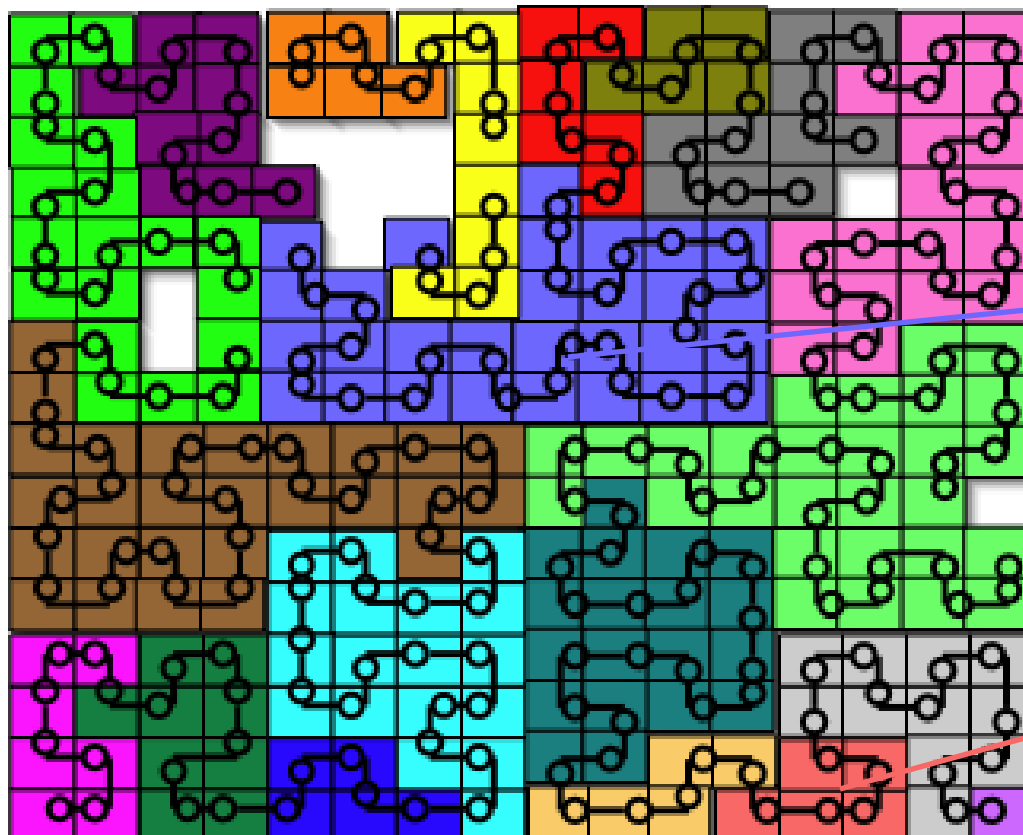
# New Computing Paradigm

A background image showing the silhouettes of two camels and a person walking across a desert landscape at sunset. The sun is a large, bright white circle in the center of the sky, which is a deep red color. The silhouettes are dark against the bright sky.

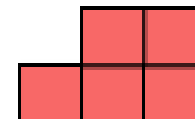
**9. The unprecedented level of parallel computation and heterogeneous computing platforms will require new systems software, new algorithms and substantial re-coding of existing climate models.**

**10. The massive scale of these computations will also require new methods in workflow management, data management, and visualization.**

# Static, Weighted Load Balancing Example: Space Filling Curves for CICE4 @ 1° on 20 processors



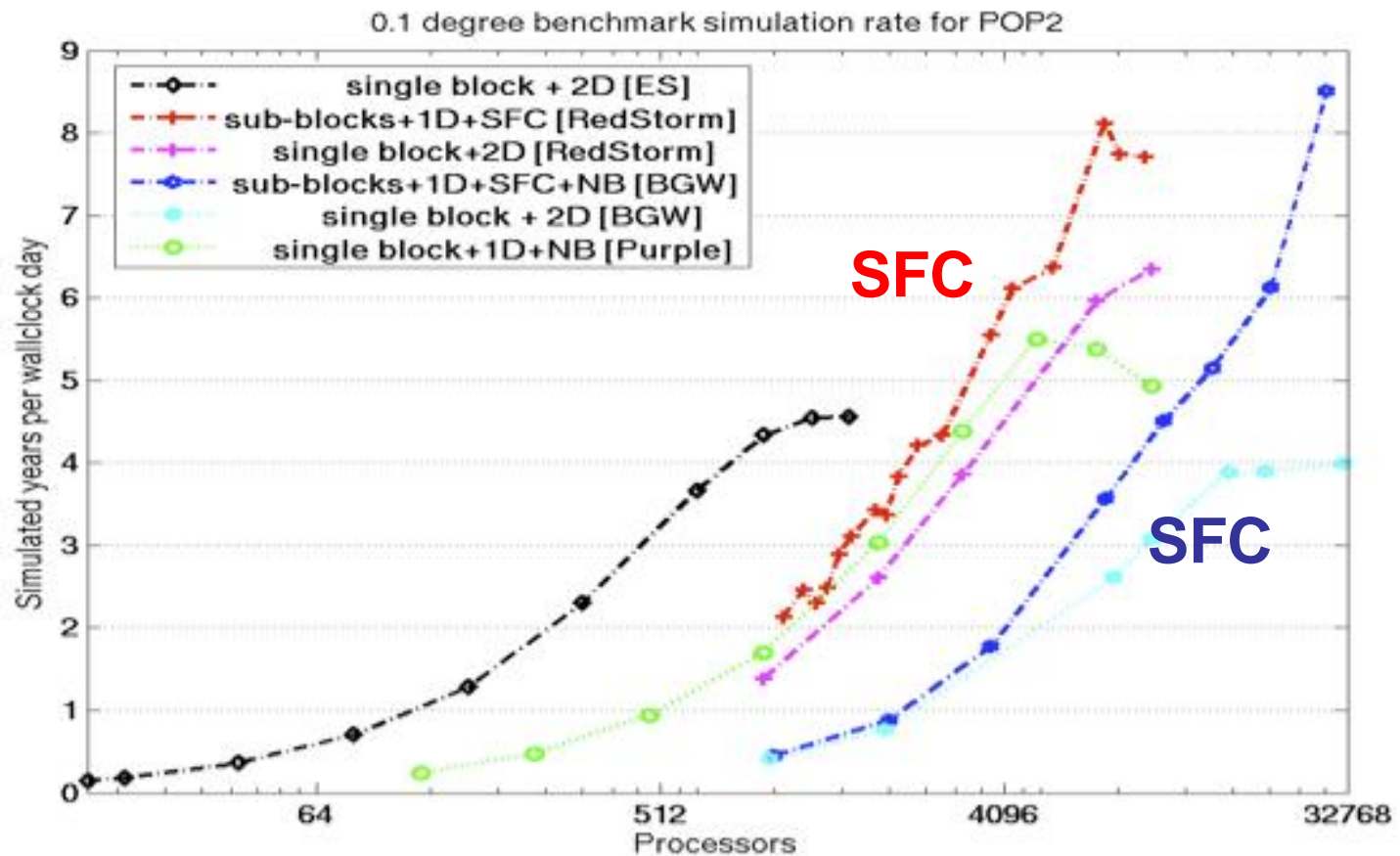
Large domains @ low latitudes



Small domains @ high latitudes

Courtesy John Dennis, NCAR





Credit: J. Dennis, Y. Yoshida, M. Taylor, P. Worley

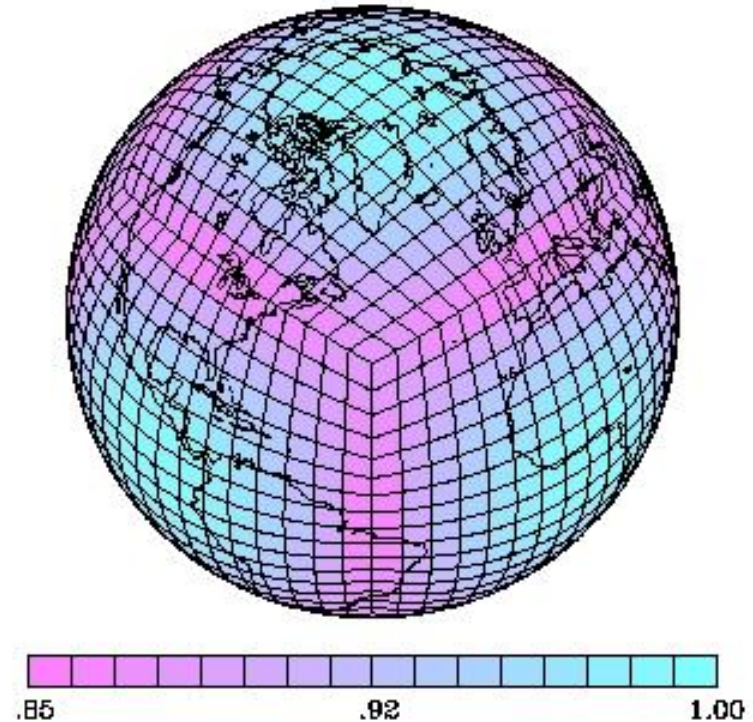
22 October 2007



# Example of highly scalable algorithms:

## High Order Multiscale Modeling Environment (HOMME)

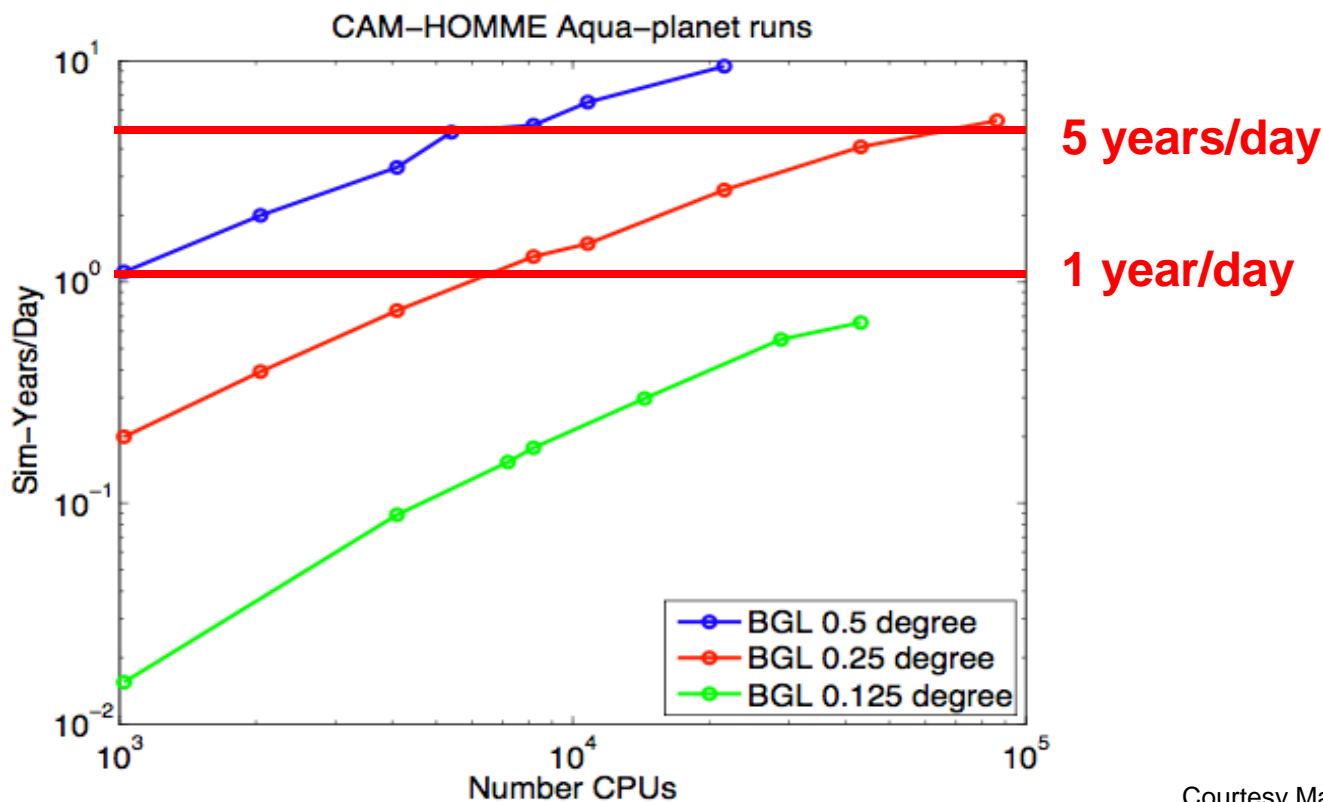
- Sphere is decomposed into 6 identical regions using a central projection (Sadourny, 1972) with equiangular grid (Rancic et al., 1996).
- Avoids pole problems, quasi-uniform.
- Non-orthogonal curvilinear coordinate system with identical metric terms



**Ne=16 Cube Sphere  
Showing degree of  
non-uniformity**

# Today, scalable dycores can't break 1 simulated year per day even at 12.5 km...

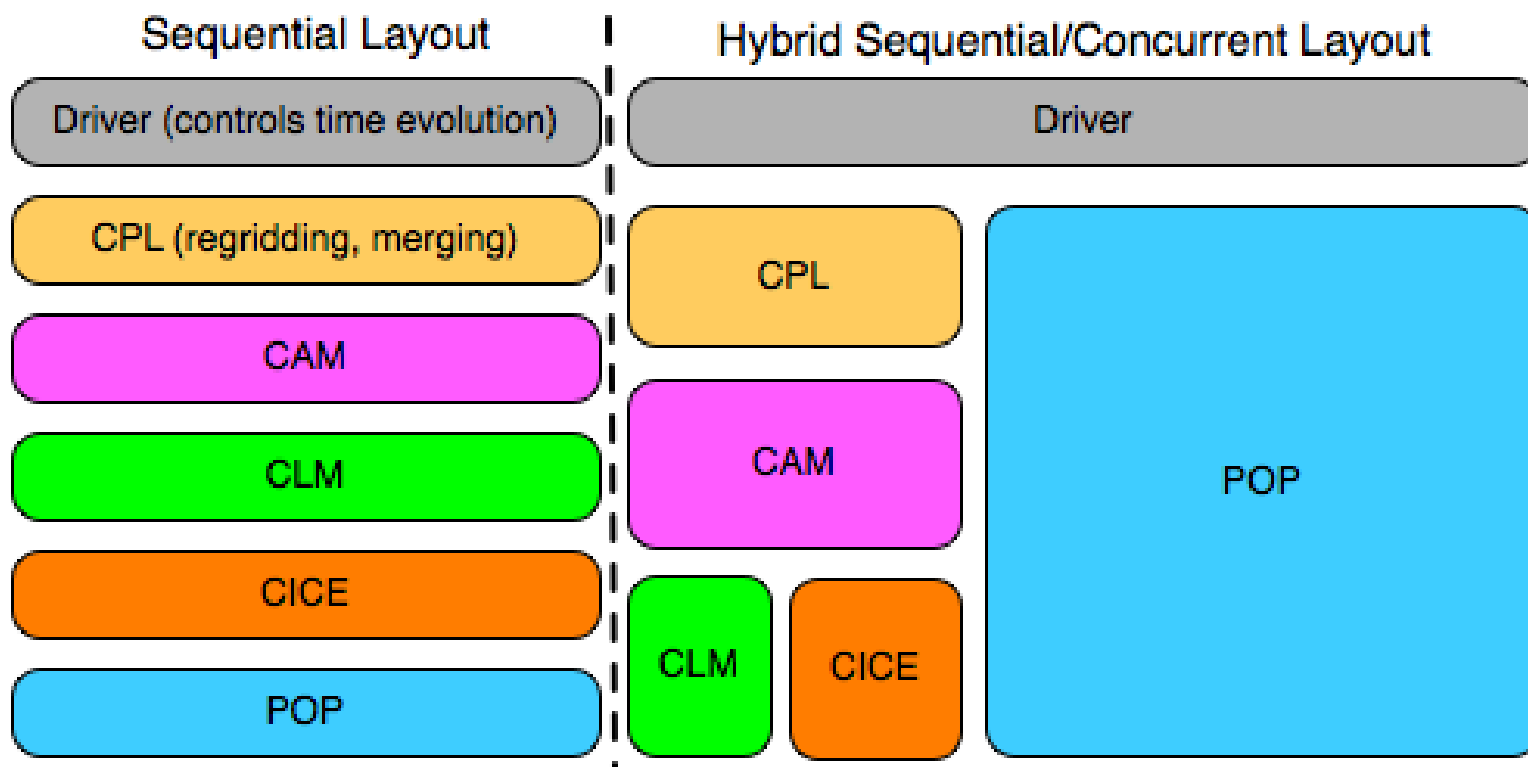
Full CAM Physics/HOMME Dycore on Blue Gene/L  
Parallel I/O library used for physics aerosol input and input data  
( work COULD NOT have been done without Parallel IO)  
Work underway to couple to other CCSM components



Courtesy Mark Taylor, SNL

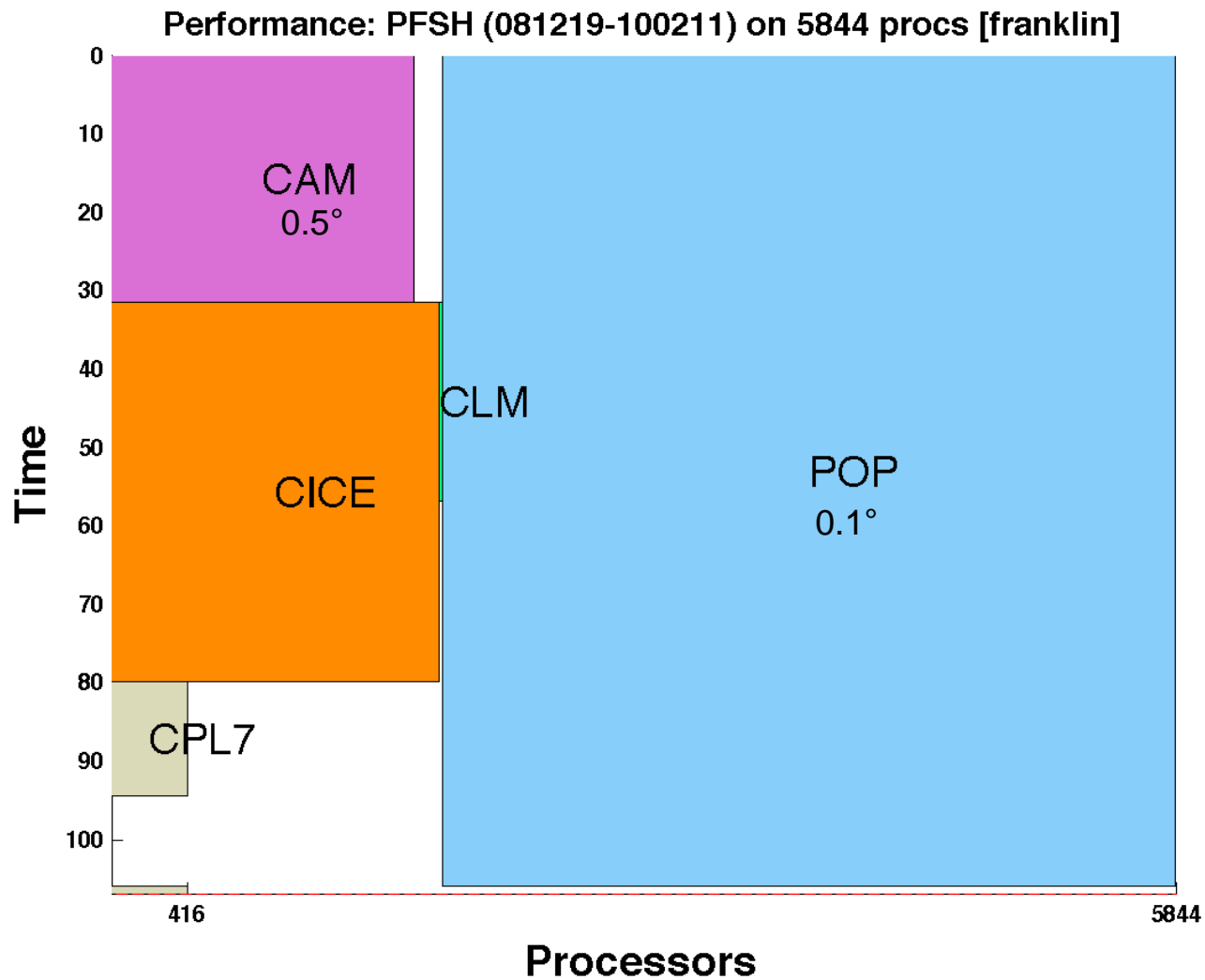
# The Dynamical Core Ain't Everything ...

CCSM4 architecture (CPL7)



Courtesy Mariana Vertenstein, NCAR



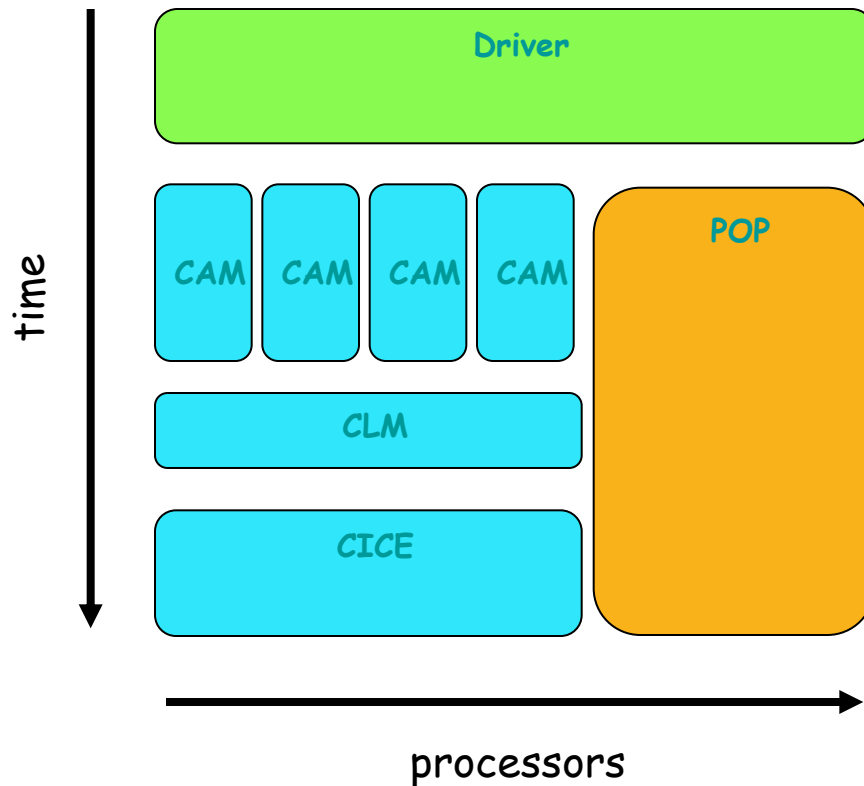


Courtesy John Dennis, NCAR

# PetaApps

NSF PetaApps proposal funded - three-year research and development effort, aimed at enabling a broad climate science capability for petascale systems

- Interactive ensembles using *CCSM/CPL7*
- Incorporate and examine use of *PGAS* language (Titanium) in *CCSM*



Interactive ensembles will be used to understand how oceanic and atmospheric weather noise impacts climate variability

Titanium will be used in the flux coupler to examine impact of *PGAS* language approach to performance and memory footprint

Courtesy Mariana Vertenstein, NCAR

# Global 1-km Model - A Simple How-To Guide

- **Objective:** Global, atmospheric dycore (100 levels) simulating 1 yr per wallclock-day (satisfying CFL)
- **Flops:** Need 6.37 PFLOPS sustained for 1 km resolution
  - Fluid codes on microprocessor-based computers get 5% of peak (e.g. 1 GFLOPS per core on IBM Power6)
  - Need ~6 million processors (assuming quite optimistic scaling) in 180X180X180 torus topology
  - Power requirement: 200-300 MW
- **Communications:** Need link bandwidths ~100 GB/sec = 10X Cray XT5 link bandwidth
  - ~510M horizontal grid points; patch-size 9x9x100 per core for 6 million cores
  - For 10 prognostic variables, 35 MB/sec/patch keeps up with 1 Gflops per core, assuming overlapping communications. Without overlapping communications, need 10-20X = 350-700 MB/sec/patch.
- **Data Storage:** 100 sim-years = 1 exabyte generated in 100 days
  - Need high levels of data management parallelism
  - Visualization requires sophisticated data compression and subsetting techniques.
  - Other multipliers: ensembles, non-atmospheric components, ...

Courtesy Rich Loft, NCAR

# Upshot ...

- To do 1 km modeling at 1 year per day in 2009 would require at least a **6 million core machine and 200 MW**.
- That is beyond current engineering capability
  - Processor speed is stuck
  - Amdahl's Law is a formidable barrier
  - Mean time between failures goes like  $1/N$  for  $N$  components
  - How long does it take to synchronize 10 million threads?
- Dynamical timestep goes like  $N^{-1}$ 
  - CFL is merciless
  - The cost of (subcycled) dynamics relative to physics increases with resolution ( $N$ )
    - e.g. if dynamics takes 20% at 25 km it takes 86% of the time at 1 km
- The amount of data produced is  $O(\text{exabytes})$  and vastly exceeds the capabilities of serial postprocessing systems to analyze

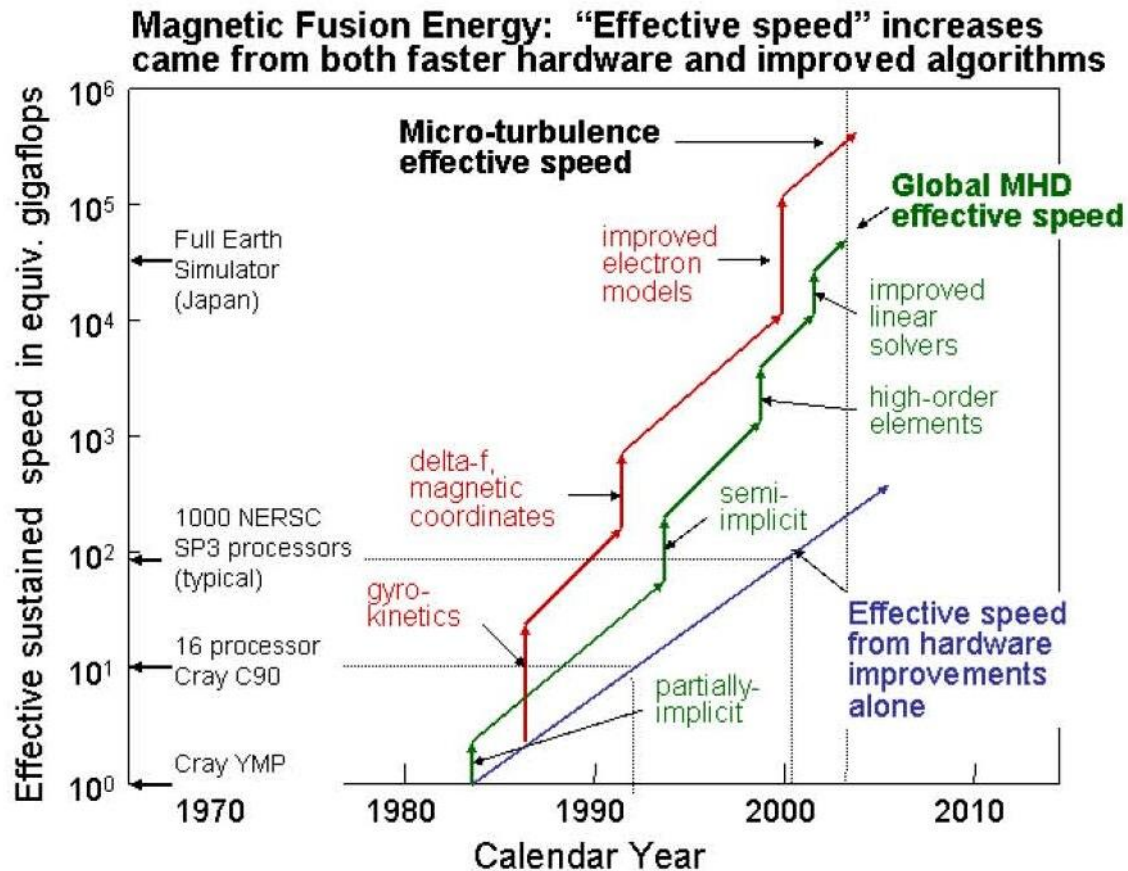
Courtesy Rich Loft, NCAR



# The Good News ...

- To do **20 km** modeling at **1 year per day** would require a dedicated machine with **~15,000 cores**
- That is within reach of current engineering capability
- To do a **global change run at 20 km**, for which **5 years per day** would be a more reasonable throughput requirement, it is probably necessary to have a dedicated machine with **~100,000 cores**
- Scaling will be a challenge on current architectures, but Blue Waters may rise to this challenge

# Algorithmic Acceleration is Important: The History of MHD Simulations



SCaLeS Report, 2004

# Trade-offs in Numerical Properties

## Desired Properties

- Local and global conservation
- High order accuracy
- Computational efficiency
  - Flops per unit space-time volume
- Geometric properties
  - Flexibility
  - Uniformity
- Non-oscillatory advection - monotonicity
- High scalability

## Issues

- Conservation schemes force specific PE formulations
- High order accuracy conflicts with computational efficiency and monotonicity (Gudonov)
- Non local/irregular communication and memory access patterns of SLT, AMR, etc.
- Solver non-locality (e.g. of inner products) conflicts with scalability.

Courtesy Rich Loft, NCAR

# Existing computers have high penalties for non-locality

## HPC Challenge Benchmarks

### HPL

System	Achieved (TFLOPS)	Affiliation
Cray XT5	902.0	ORNL
IBM BG/L	259.2	LLNL
IBM BG/P	191.3	ANL

### GFFT

System	Achieved (TFLOPS)	Affiliation
IBM BG/P	5.080	ANL
Cray XT3	2.870	SNL
Cray XT5	2.773	ORNL

**Best HPL to Best FFT Ratio: 177.6 !**



# Computational Intensity (CI)

- Compute Intensity:

$$CI = \text{Total Operations} / (\text{Input} + \text{Output data})$$

- **GFLOPS = CI\*Bandwidth**
- Bandwidth expensive, flops cheap
- The higher the CI, the better we're able to exploit this state of affairs

Courtesy Rich Loft, NCAR

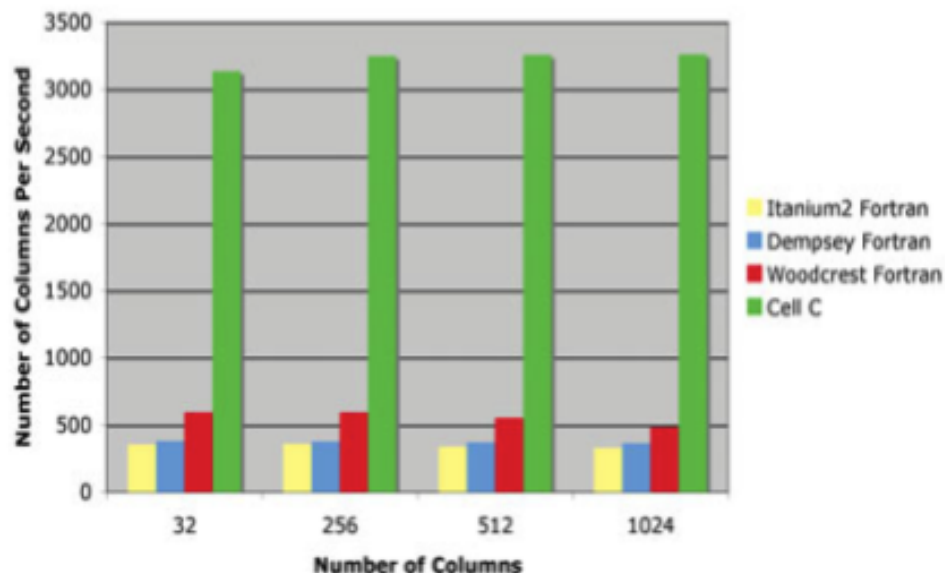
# NASA High-End Computing (HEC) Program Study

## NASA Goddard, July 24, 2008

Presented at 2008 International Supercomputing Conference (ISC '08), June 18-20, Dresden, Germany.

Study lead: Shujia Zhou, Reference: <http://www.hec.nasa.gov/news/features/2008/cell.074208.html>

- Workload: Solar Radiation component from Goddard Earth Observing System Model, Version 5 (GEOS-5) – 20% of GEOS-5 computing time.
  - Computationally intensive & I/O time smaller than computation time
  - Relatively small code size (~2,000 Fortran lines)
  - Vertical column data allowed for independent computation, reducing communication
- Porting
  - Ported code to C. **Note: IBM XL Fortran compiler for Cell is not available**
  - Adding Direct Memory Access library calls to communicate with SPE's.
  - Determine best mapping across 8 SPE's per Cell/B.E. processor
- Currently working towards exploiting the Cell Fortran compiler: with a hybrid version of the solar radiation component.
- Future work...
  - GEOS-5 atmospheric model component for **turbulence, moisture, chemistry**, and other processes, which collectively take about 50 percent of GEOS-5 computing time.
  - More sophisticated models, including **cloud-resolving** models – requiring more than 10x computing power



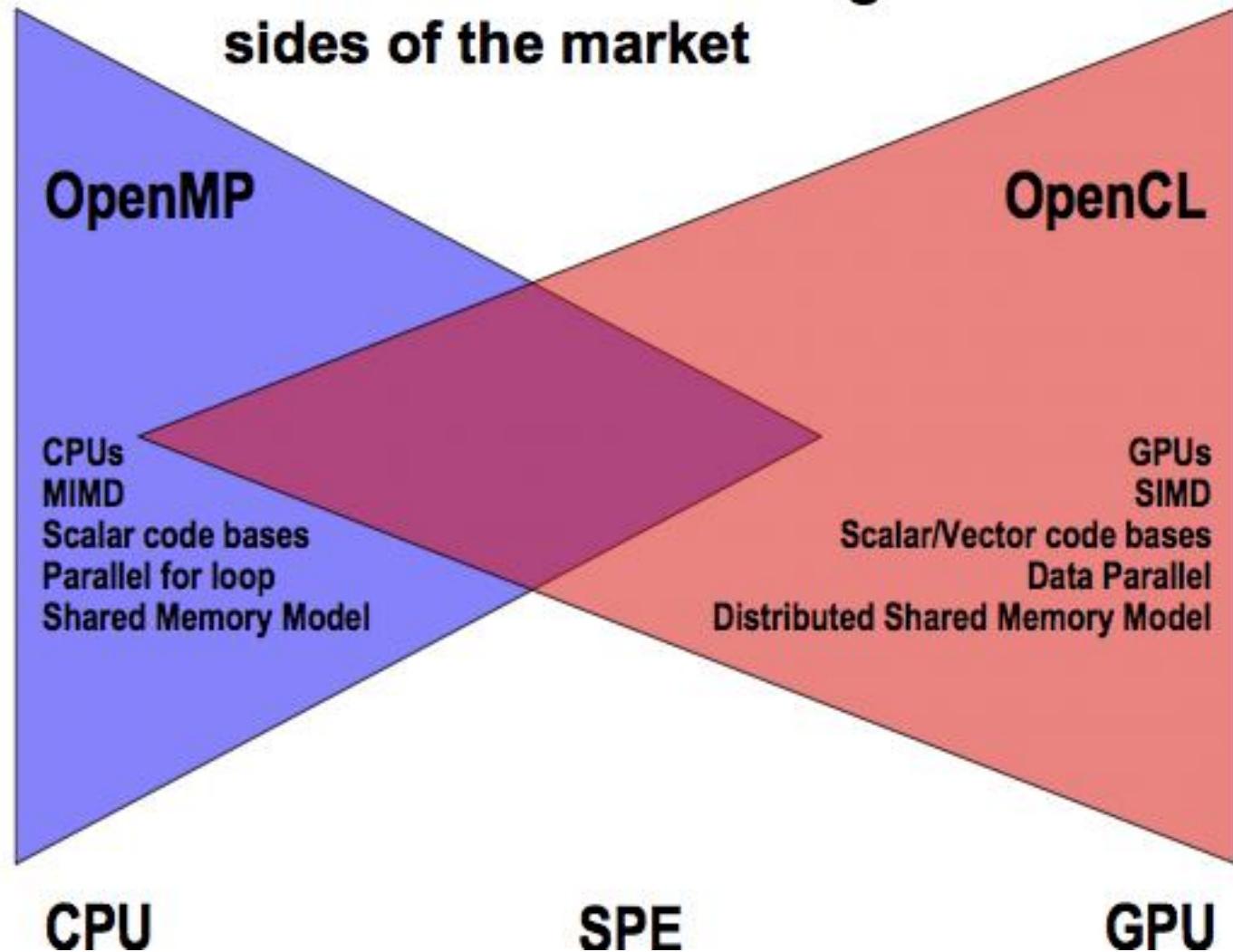
### Cell was ...

- 6.76x faster than Intel Xeon Woodcrest (2.66 GHz)
- 8.91x faster than Intel Xeon Dempsey (3.2 GHz)
- 9.85x faster than Intel Itanium2 (1.5 GHz)

QS22 is 3.73% faster than QS20 data values above.

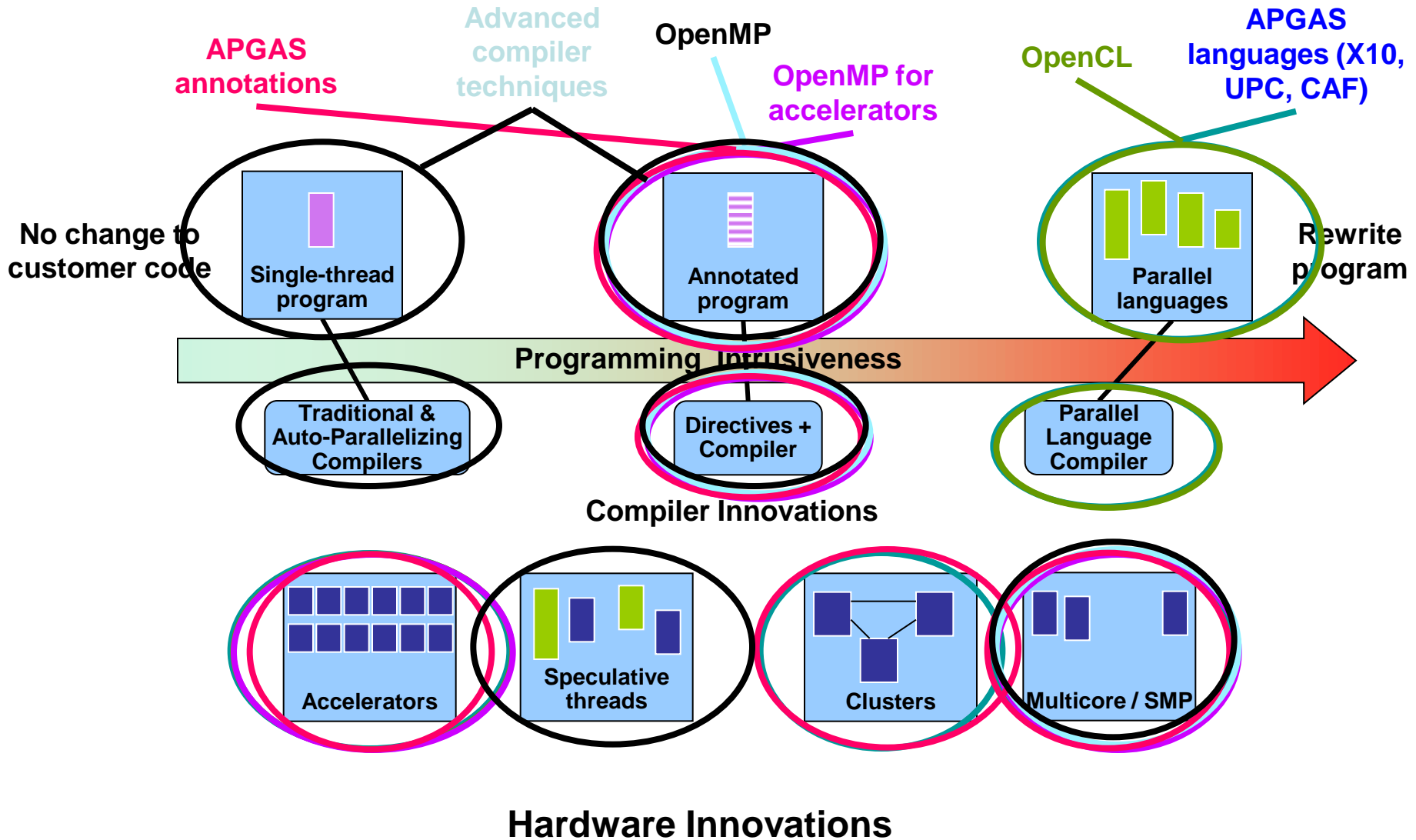
Courtesy Kent Winchell, IBM

- **Two standards evolving from different sides of the market**



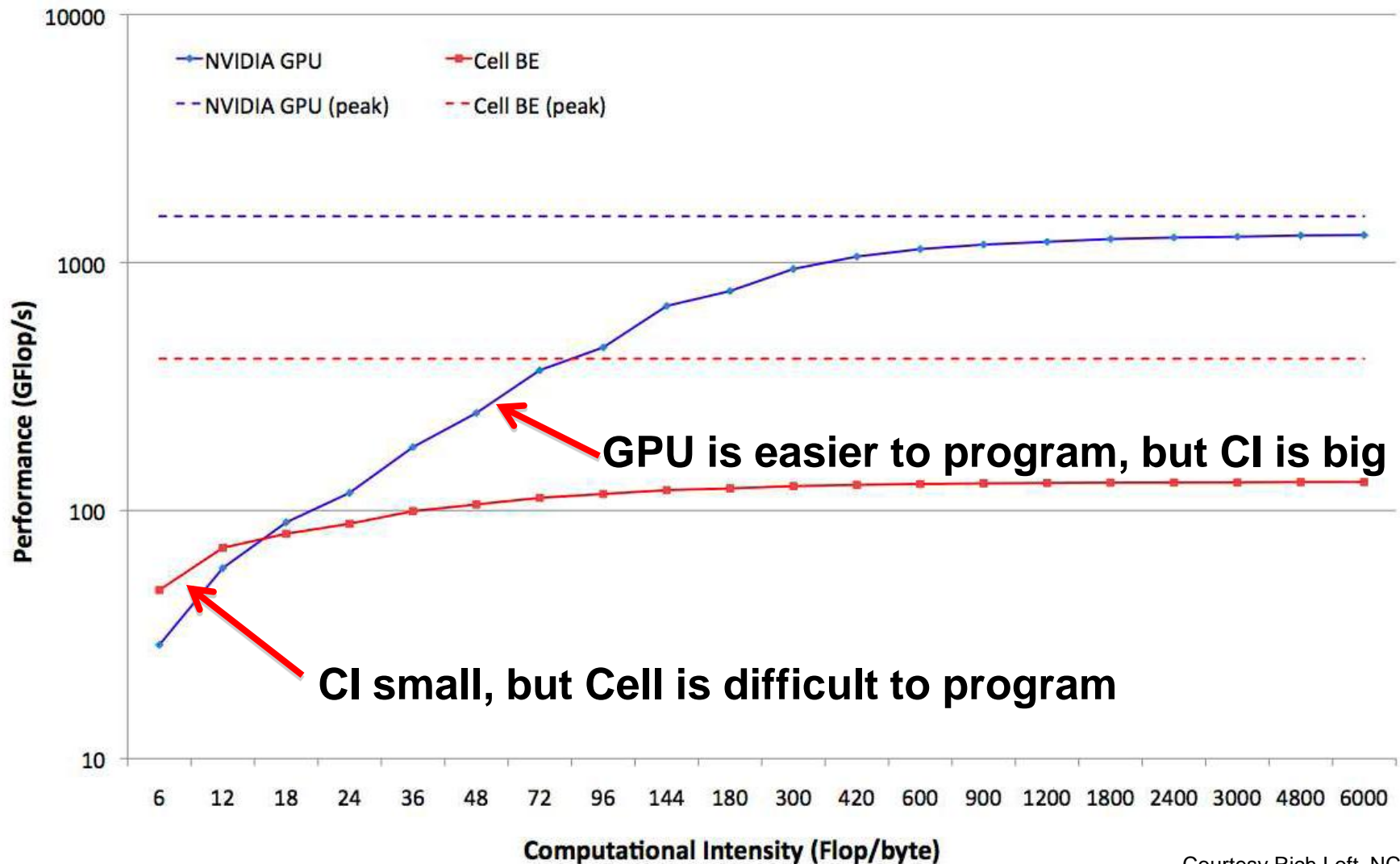
Courtesy Kent Winchell, IBM

# Different approaches to exploit hybrid systems





# Where's the tipping point for Accelerators: Cell and GPU's?



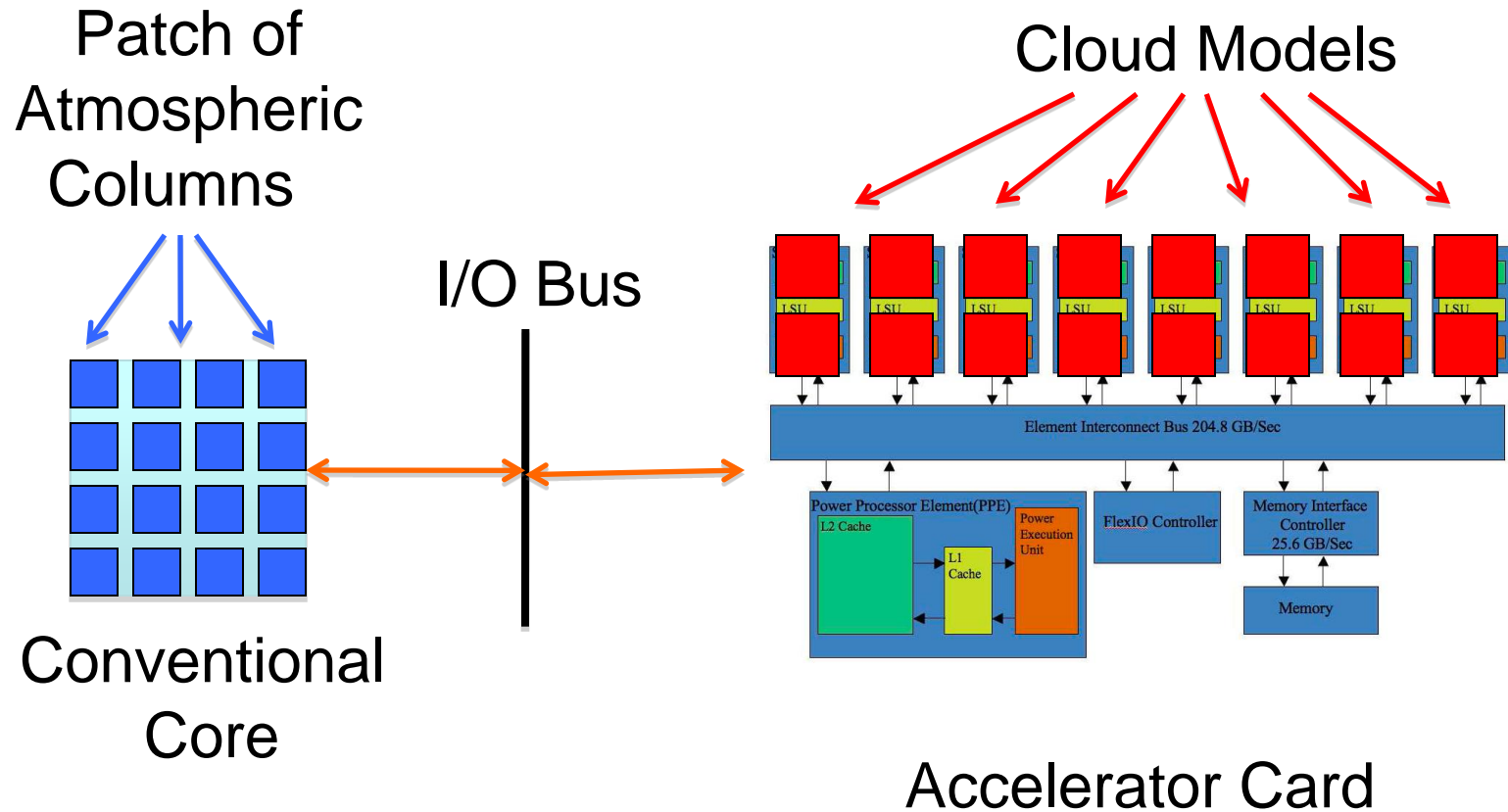
Courtesy Rich Loft, NCAR

# Example - Super-parameterization: An intermediate step in the quest for a cloud-system-resolving AGCM

- Super-parameterization is **embarrassingly parallel but extremely expensive** (~150x traditional physics)
- The computational cost of the following simulations are approximately the same:
  - A **millennium**-long simulation using a traditional climate model.
  - A **few years**-long simulation using a traditional climate model with CRCP (MMF or SP)
  - A **day**-long simulation of a cloud-system-resolving AGCM O(1 km)

Courtesy Rich Loft, NCAR

# Running “Super Parameterization” on an Accelerator Cluster



Courtesy Rich Loft, NCAR

# 10 Points

A silhouette of two camels and a person walking across a desert landscape at sunset. The sun is a large, bright white circle in the center of the sky, which transitions from a deep red at the horizon to a lighter orange at the top. The camels and the person are dark silhouettes against the bright sky.

1. **Climate change is most difficult and important problem**
2. **Scientific consensus: humans contribute to climate change**
3. **World, urgently engaged in global mitigation and regional adaptation strategies, needs detailed regional information**
4. **IPCC AR4: considerable uncertainty in predictions of magnitude of global change**
5. **... and uncertainties in regional climate are even bigger**
6. **Climate prediction is very computationally demanding**
7. **Climate spatial scales span 10 decades, but current models resolve less than 4 decades**
8. **Within 6 years, peak capability of 100 petaflops,  $10^7$  computing units**
9. **Parallel computation means new software, algorithms and models**
10. **... and new methods in workflow management, data management, and visualization**



# Investments Required in:

- People and infrastructure for...
  - Algorithm Research – AMR, solvers..
  - Software Engineering – DAV tools, frameworks
  - Computational Science Research – scalability, fault tolerance
- Architectural innovations including...
  - Global reduction networks
  - Robust I/O subsystems
  - Tighter integration of accelerators and  $\mu$ procs
- New modeling schemes, such as...
  - pairing sub-grid-scale models with accelerators

Courtesy Rich Loft, NCAR

# Working on Climate Scalability Requires Big Interdisciplinary Teams

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- DOE-ASCR
  - B&R KJ0101030
- NSF Cooperative Grant NSF01
- NSF PetaApps Award

- **Computer Time:**

- Blue Gene/L time:
  - NSF MRI Grant
  - NCAR
  - University of Colorado
  - IBM (SUR) program
  - BGW Consortium Days
  - IBM research (Watson)
  - LLNL
  - Stony Brook & BNL
- CRAY XT time:
  - NICS/ORNL
  - NERSC
  - Sandia

# Scale of the Enterprise

- Computational Power – **Petaflops/sec**
- Data Volumes – ~~Petabytes~~ **Exabytes**
- Model re-coding for massively parallel architectures → **100 dedicated person-years**
- Climate data assimilation, initialisation and reanalysis → **100 dedicated person-years**
- **Sufficient expertise** in climate and Earth system processes

Challenge will be securing critical capability  
in all these areas.

Is it beyond the capacity of a single country?

Is it time to tackle this together and avoid duplication of  
effort?

Courtesy of Julia Slingo  
World Modeling Summit, May 2008, Reading, UK

# Summary

- Considerable progress in weather & climate modeling over the past 45 years along with a  $10^9$ -fold increase in computing
- Breakthroughs in the next decade will require huge increases in model resolution & complexity  $\rightarrow 10^{3+}$  X increase in computing capability, along with work on entire spectrum of issues in high-end computing and model & code development
- We are not currently organized as a community to step up to this challenge
- This problem may be larger than any single nation can address ... international cooperation is required to accelerate progress and productively use petascale computing for climate prediction.